8 10 11 12

14 15 16 17 18

19

13

20 21 22 23 24 25 26

27

28 29 30 31 32 33 34 35

36 37 38 39 40 41 42 43 44 45

46 47

48 49

Music Theory with Dependent Types (Experience Report)

ANONYMOUS AUTHOR(S)

Throughout history, music has been composed following general rules and guidelines, expressed informally through natural language and examples. The expressiveness of dependent type theory allows us to capture these rules formally, and then use them to automate analysis and synthesis of music.

In this experience report, we explore expressing a small subset of the rules of the common practice period in Agda, a functional programming language with full dependent types. We focus on the construction of species counterpoint as well as four-part harmonization of melody. We point out both the advantages of using dependent types to express music theory and some of the challenges that remain to make languages like Agda more practical as a tool for musical exploration.

CCS Concepts: • Applied computing → Sound and music computing; • Software and its engineering \rightarrow Functional languages; • Theory of computation \rightarrow Type theory.

Additional Key Words and Phrases: dependent types, counterpoint, harmony

ACM Reference Format:

Anonymous Author(s). 2020. Music Theory with Dependent Types (Experience Report). Proc. ACM Program. Lang. 4, ICFP, Article 1 (August 2020), 10 pages.

1 INTRODUCTION

Edgar Varèse describes music as "organized sound", and throughout history cultures have developed and applied systems of rules and guidelines to govern the music they create, most notably the Common Practice Period of Western music spanning the 17th to early 20th centuries. These rule systems are seldom absolute, and indeed deliberate breaking of the rules is often part of the aesthetic, but they roughly constrain the music they apply to and give it a common form and sound.

Artists and theoreticians have attempted to capture and codify these rule systems, informally in natural language, and typically accompanied by examples from the existing literature. The intent is both to analyze existing music and then to use these principles to guide the creation of new music, in other words for synthesis.

Starting in the 20th century, computers have become ubiquitous in music in every area, including sound sythesis, composition and production [Roads et al. 1996]. In terms of music theory, there has been a line of recent work on using functional programming for harmonic analysis [De Haas et al. 2011, 2013; Magalhães and de Haas 2011], harmonization of a melody and generation of melodies based on a harmonization [Koops et al. 2013; Magalhães and Koops 2014] and counterpoint [Szamozvancev and Gale 2017]. There is also an established Haskell library Euterpea [Hudak and Quick 2018] for general music and sound exploration.

To describe rules of basic harmonic structure, Magalhães and de Haas [2011] and their successors use dependent types, for example to index chords by major or minor mode. However Haskell currently has limited support for dependent types, and requires many extentions and tricks such as the use of singleton types [Eisenberg and Weirich 2013].

In this paper we explore what can be done in the context of music by using a programming language that offers full dependent types. We use Agda [Norell 2007] since it is fairly mature and aims to be both a functional programming language and a proof assistant. It also features a Haskell FFI so we can take advantage of existing Haskell libraries, in partiular for MIDI generation.

97 98 1:2

50

0 0 O O 0 ģ R ဓ္ -00 00 R min2 maj2 min3 maj3 per5 min6 maj6 min7 maj7 per8 per1 per4 aug4 consonant? yes no no yes yes ves no no ves ves ves no no

Fig. 1. 13 Kinds of Intervals

Anon.

Full dependent types allow expression of predicate logic, and it is tempting to take a standard textbook on music theory such as Piston and DeVoto [1987] or Aldwell and Cadwallader [2018] and formalize it in type theory. As a first step towards this goal, we start with the modest task of expressing a small, relatively strict rule set known as species counterpoint [Fux 1965], intended for combining interdependent melody lines to produce a pleasant-sounding result. Roughly speaking, what we do is to write a custom musical type checker in Agda. Compared to the previous work by Cong and Leo [2019], where rules are expressed directly as Agda types, our approach makes it easier to describe fine-grained rules, produce readable error messages, and add or drop rules depending on the circumstances.

We also present preliminary work on harmonizing a melody using a subset of rules based on Piston and DeVoto [1987], contrasting with existing work by Koops et al. [2013]. Since counterpoint and harmony are not separate concepts but in fact deeply intertwined, we would wish to reuse counterpoint rules to develop natural-sounding harmonizations. We show that, with our custom type checker, it is straightforward to reuse rules in different contexts. Put differently, our representation of rules satisfies modularity.

The rest of this paper structured as follows. Section 2 introduces basic musical concepts as well as their Agda representation. Sections 3 and 4 describe our formalization of counterpoint and harmony, focusing on the composable and modular aspects of the proposed approach. Lastly, Section 5 concludes the paper with future perspectives.

This is an experience report, and we highlight both the advantages and disadvantages of using Agda for music theory. On one hand the expressiveness of dependent types makes it easy and natural to describe music theory rules. On the other hand we find the emphasis on proof construction and particularly the extra work needed for decidable equality can add an extra burden which is not always welcome. However overall we feel the positives far outweigh the negatives, and in the final section we discuss possible ways to reduce the tedium.

2 BASIC MUSICAL TERMS AND THEIR REPRESENTATION IN AGDA

Pitches. A *pitch* tells us how high or low a sound is. We represent pitches as natural numbers, but throughout the paper, we use a more readable notation name octave, where name ranges over c, d, e, etc., and octave denotes which octave the pitch belongs to. For instance, the middle C is represented as c 5.

Duration. Duration denotes an unspecified unit of time during which a sound or silence lasts. We represent duration as a natural number, and use this value to calculate the absolute length when the music is played at a specific tempo. As an example, the duration constant whole has value 16 and corresponds to 4 seconds if the tempo is 60 beats per minute.

Notes. Combining pitches and duration gives us *notes.* We represent notes as a datatype Note with two constructors: tone for notes with sound and rest for those without. For example, tone whole (c 5) is a whole note whose sound is the middle C.

111 112

124

125 126

127

128

129 130 131

132

133

142 143

147



Fig. 2. First Species Counterpoint

Intervals. An *interval* represents the difference in pitch between two notes. There are 13 kinds of interval within an octave (Figure 1), and these intervals can be classified from several different perspectives: (i) major or minor; (ii) consonant or dissonant; and (iii) perfect or imperfect. We define intervals as a datatype Interval, where each constructor represents one of the 13 intervals.

3 COUNTERPOINT

Counterpoint is a technique for combining multiple lines of melodies. Composing counterpoint is like arranging a song for choir: we start with a cantus firmus, which serves as the base melody, and compose a counterpoint line above or below the cantus firmus. When doing this, we must make sure that the whole music sounds harmonically pleasing, and that the individual melodic lines are distinguishable to the listener.

In this section, we present an implementation of species counterpoint, based on the formulation given by Fux [1965]. The idea is to represent "good" counterpoint as a dependent record, whose fields encode the musical content as well as proofs that the counterpoint follows certain rules. For space reason, we only describe two variants of species counterpoint; other variants can be formalized in an analogous way.

First Species Counterpoint

First species counterpoint is the simplest variant of counterpoint. In first species, we set one note against each note in the cantus firmus, which is required to start with a tonic (the first note of a scale, such as C in C major) and consist only of whole notes. Figure 2 shows an example of first species counterpoint. The lower line is the cantus firmus, which we excerpt from a German song called *Froschgesang* (Frog's song). The upper line is the counterpoint composed by the second author.

3.1.1 Representing Music. In our implementation, we represent each bar as a pitch-interval pair (p, i), where p is the pitch of a cantus firmus note, and i is the interval between p and the corresponding counterpoint note. We then represent a sequence of bars as a list of pitch-interval pairs, but with one proviso: we separate the first and last bars from the middle bars. Therefore, the Frog's song in Figure 2 is represented as a compound of the following three elements:

```
first : PitchInterval -- Pitch × Interval
     first = (c 5, per8)
139
140
     middle : List PitchInterval
141
     middle = (d 5 , maj6) :: (e 5 , min6) :: (f 5 , maj3) ::
               (e 5 , min3) :: (d 5 , maj6) :: []
144
     last : PitchInterval
145
     last = (c 5, per8)
146
```

1:4 Anon.

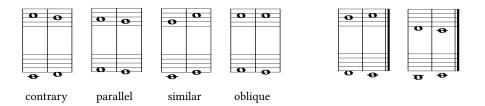


Fig. 3. Motion (left) and Cadence (right)

3.1.2 Representing Rules. The reason behind our three-part representation of music is that different parts are subject to different rules, as we detail below.

Beginning. The beginning of the music should express perfection. As we saw in Section 2, there are three intervals that are classified as perfect: the 1st (usually called the *unison*), 5th, and 8th. The first interval of the music must then be one of these intervals. In our formalization, we implement this rule as the checkBeginning function, which reports an error not158 i when the first interval i is an invalid one. Since Agda does not have exceptions, we turn the error into a Maybe value by wrapping it around the just constructor.

```
not158 : PitchInterval → BeginningError

checkBeginning : PitchInterval → Maybe BeginningError
checkBeginning pi@(_ , i) =
  if ((i == per1) ∨ (i == per5) ∨ (i == per8))
  then nothing
  else just (not158 pi)
```

data BeginningError : Set where

data IntervalError : Set where

 Intervals. The middle bars of the music should maintain harmonical consonance and independence of melodic lines. As we saw before, consonant intervals include the unison, 3rd¹, 5th, 6th, and 8th, and among these, the unison is clearly an obstacle to distinguishing between the two lines of music. Therefore, the middle bars must consist only of the latter four intervals. We encode this rule as the checkIntervals function, which returns a list of errors corresponding to the occurrences of dissonant intervals and unisons.

```
dissonant : Interval \rightarrow IntervalError unison : Pitch \rightarrow IntervalError intervalCheck : PitchInterval \rightarrow Maybe IntervalError intervalCheck (p , i) with isConsonant i | isUnison i intervalCheck (p , i) | false | _ = just (dissonant i) intervalCheck (p , i) | _ | true = just (unison p) intervalCheck (p , i) | _ | = nothing checkIntervals : List PitchInterval \rightarrow List IntervalError checkIntervals = mapMaybe intervalCheck
```

¹We use "3rd" to mean both the major and minor variants of the 3rd interval, and similarly for the 6th.

198 199

200

201

202

203 204

221

222

223

224

225

226

245

Motion. The independence of melodic lines is also affected by motion, i.e., the way one interval moves to another interval. As Figure 3 left shows, there are four kinds of motion: contrary (two lines go in different directions), parallel (two lines go in the same direction by the same distance), similar (two lines go in the same direction by different distances), and oblique (one line plays the same note). It is known that approaching a perfect interval by parallel or similar motion tends to fuse the melodic lines into one. To rule out such motion, we define the checkMotion function, which inspects all pairs of two adjacent intervals (using an auxiliary function pairs) and returns a list of erroneous patterns.

```
205
     data MotionError : Set where
206
       parallel : PitchInterval → PitchInterval → MotionError
207
       similar : PitchInterval → PitchInterval → MotionError
208
209
     motionCheck : PitchInterval → PitchInterval → Maybe MotionError
210
     motionCheck i1 i2 with motion i1 i2 | isPerfect (proj_2 i2)
211
     motionCheck i1 i2 | contrary | _
                                          = nothing
212
     motionCheck i1 i2 | oblique | _
                                           = nothing
213
     motionCheck i1 i2 | parallel | false = nothing
214
     motionCheck i1 i2 | parallel | true = just (parallel i1 i2)
     motionCheck i1 i2 | similar | false = nothing
     motionCheck i1 i2 | similar | true = just (similar i1 i2)
217
218
     checkMotion : List PitchInterval → List MotionError
     checkMotion = mapMaybe (uncurry motionCheck) ○ pairs
220
```

Ending. The ending of the music should express relaxation. There is a concensus that the unison and 8th are the most stable intervals, hence the music must end with either of these intervals. The last interval should also be approached by a *cadence*, a progression that gives rise to a sense of resolution (Figure 3 right). This in turn suggests that a valid ending requires the middle bars to be non-empty. We encode these rules as the checkEnding function, which, upon finding an invalid ending, reports one of the three possible errors.

```
data EndingError : Set where
227
                  : PitchInterval
        not18
                                         → EndingError
228
                  : PitchInterval
                                         → EndingError
229
       not27
230
        tooShort : List PitchInterval → EndingError
231
     endingCheck : PitchInterval → PitchInterval → Maybe EndingError
232
     endingCheck pi1@(pitch p , i) (pitch q , interval 0) =
233
        if ((p + 1 \equiv^b q) \land (i == min3)) then nothing else just (not27 pi1)
234
     endingCheck pi1@(pitch p , i) (pitch q , interval 12) =
235
        if ((q + 2 \equiv^b p) \land (i == maj6) \lor (p + 1 \equiv^b q) \land (i == min10))
236
        then nothing
237
        else just (not27 pi1)
238
     endingCheck pi1
                                                                  =
                                       pi2
239
240
        just (not18 pi2)
241
     checkEnding : List PitchInterval \rightarrow PitchInterval \rightarrow Maybe EndingError
242
     checkEnding []
                              _ = just (tooShort [])
243
     checkEnding (p :: []) q = endingCheck p q
244
```

1:6 Anon.



Fig. 4. Second Species Counterpoint

```
checkEnding (p :: ps) q = checkEnding ps q
```

3.1.3 Putting Things Together. Using the encoding of music and rules we have seen so far, we define FirstSpecies, a record type inhabited by correct first species counterpoint. The first three fields of this record type represent the first, middle, and last bars, respectively. The last four fields stand for the proofs that the music satisfies all the required properties.

```
record FirstSpecies : Set where
  constructor firstSpecies
  field
    firstBar : PitchInterval
    middleBars : List PitchInterval
```

lastBar : PitchInterval
beginningOk : checkBeginning firstBar ≡ nothing
intervalsOk : checkIntervals middleBars ≡ []

motionOk : checkMotion (firstBar :: middleBars) ≡ [] endingOk : checkEnding middleBars lastBar ≡ nothing

With this record type, we can show that the counterpoint in Figure 2 is correct, since the music is an inhabitant of FirstSpecies.

```
fs : FirstSpecies
fs = firstSpecies first1 middle1 last1 refl refl refl
```

3.2 Second Species Counterpoint

first2 : PitchInterval

We next discuss a more complex variant of counterpoint, called the second species. In second species, we set *two* half notes against every cantus firmus note. This gives rise to the distinction between *strong* beats (the first interval in a bar) and *weak beats* (the second interval). Figure 4 is an example of two-against-one counterpoint, again composed for the Frog's song.

3.2.1 Representing Music. In second species, the first and last bars may have a different structure from middle bars. More specifically, it is encouraged to begin the counterpoint line with a half rest and end with a whole note. Therefore, in our implementation, we reuse the PitchInterval type for the first and last bars, and define a new type PitchInterval2 for middle bars.

```
first2 = (c 5 , per5)

middle2 : List PitchInterval2 -- Pitch × Interval × Interval
middle2 =
   (d 5 , min3 , per5) :: (e 5 , min3 , min6) :: (f 5 , maj3 , aug4) ::
   (e 5 , min6 , min3) :: (d 5 , min3 , maj6) :: []
```

```
last2 : PitchInterval
last2 = (c 5 , per8)
```

296

298

300

302

303

304

306

307

308

309

310

311 312

313

314 315

316

319

320

321

322

324

326

328

329

330

331

333

334

335 336

337

338

339

340 341

342 343 3.2.2 Representing Rules. The rules for second species counterpoint can be obtained by tweaking those for first species and adding a few new ones. Here we go through the rules without showing the corresponding Agda functions, as they are largely similar to what we defined for first species.

Beginning. The beginning of the music may be either the 5th or 8th, but *not* the unison, as it prevents the listener from recognizing the beginning of the counterpoint line.

Strong Beats. Strong beats in middle bars are constrained by the same rules as in first species: they must all be consonant, non-unison intervals.

Weak Beats. Weak beats are allowed to be dissonant if they are created by a passing tone, i.e., a note in the middle of two step-wise motions in the same direction (as in bars 4-5 of Figure 4). They may also be the unison if they are left by step in the opposite direction from their approach (as in bars 5-6 of Figure 4).

Motion. Parallel and similar motion towards a perfect interval is prohibited across bars.

Ending. The last interval must be the unison or 8th, preceded by an appropriate interval that constitutes a cadence structure.

3.2.3 Putting Things Together. Now we define SecondSpecies, a record type inhabited by correct second species counterpoint. As in FirstSpecies, we have three fields holding the musical content, followed by five fields carrying the proofs of the required properties disucssed above².

```
constructor secondSpecies
field
  firstBar
                : PitchInterval
 middleBars
                : List PitchInterval2
  lastBar
                : PitchInterval
  beginningOk : checkBeginning2 firstBar ≡ nothing
  strongBeatsOk : checkStrongBeats middleBars ≡ []
  weakBeatsOk
                : checkWeakBeats middleBars (secondPitch lastBar) ≡ []
 motionOk
                : checkMotion2 (firstBar ::
                                (expandPitchIntervals2 middleBars)) ≡ []
                : checkEnding2 middleBars lastBar ≡ nothing
  ending0k
```

Using SecondSpecies, we can show that the second species counterpoint in Figure 4 is correct.

```
ss : SecondSpecies
ss = SecondSpecies first2 middle2 last2 refl refl refl refl refl
```

3.3 Comparison with Previous Work

record SecondSpecies : Set where

The type-theoretical formalization of counterpoint has previously been attempted by Cong and Leo [2019]. They represent correct counterpoint as an Agda datatype akin to a list, where the base cases enforce a valid ending and the inductive case guarantees correct uses of intervals and motion (by means of implicit arguments representing proofs).

 $^{^2}$ The auxiliary function secondPitch in weakBeatsOk extracts the counterpoint note of a given interval, and expandPitchIntervals2 turns a list of PitchInterval2s into a list of PitchIntervals.

1:8 Anon.





Fig. 5. Harmonization by Piston (left) and FHARM (right)

Our representation of counterpoint improves on the existing implementation in two ways. First, while Cong and Leo [2019] rely on the Agda type checker to report errors in the counterpoint, we use our own type checker (implemented as the checkXXX functions) and type errors (defined as the XXXError datatypes). This allows us to produce error messages that clearly state what kind of mistake the programmer has made. Suppose we have replaced the second interval of Figure 2 by an octave (8th) of D, breaking the rule that perfect intervals cannot be approached by parallel motion. In our implementation, this causes an error in the motionOk field, with the following message:

```
(parallel (c 5 , per8) (d 5 , per8) :: []) != [] of type (List MotionError)
```

In Cong and Leo [2019]'s implementation, on the other hand, the invalid motion results in an unsolved metavariable _13, representing the proof that the two intervals form a valid motion:

```
_13 : motionOk (c 5 , per8) (d 5 , per8)
```

Compared to the error message produced by our implementation, this lacks the exact information about the motion between the two intervals.

We would also like to note that the attempt to precisely reporting musical errors has appeared in the work by Szamozvancev and Gale [2017]. They formalize various musical rules, including those for intervals and motion, using GHC's custom type error feature. However, they do not aim to fully support species counterpoint, and thus do not cover as many rules as we do.

The second improvement from Cong and Leo [2019] is that, instead of incorporating all the rules into a counterpoint datatype, we define each of them as a separate function and combine them using a record type. This makes it easy to switch between strict and relaxed rule sets: we just need to add or remove certain fields. It also allows us to reuse some of the rules in a context other than counterpoint, as we will see in the next section.

4 HARMONY

 TODO: Harmonize melody, use counterpoint for voice leading and to contrain harmony. Mention grid for harmonic analsis, makes use of vectors.

5 CONCLUSION AND FUTURE WORK

We believe that functional programming, and in particular functional programming with dependent types, is the most promising way to do software engineering going forward. The languages and tools are perhaps not yet as finely polished and rich as those typically used in production software, but they are fundamentally far more powerful, and thus once the infrastructure (and training of programmers) catches up should become the languages of choice.

Music is an especially valuable domain in which to explore these ideas. We have found it to be a microcosm of issues that arise everywhere in software engineering: modularity, composability, correctness, and data issues such as handling equivalent formulations of the same data as well

slightly different formulations. If we can demonstrate that functional programming with dependent types works well in the domain of music, the same techniques can be used in software in general.

Data issues are particularly prevalent at API boundaries between systems, which may internally represent the data in different formats (satisfying modularity and abstraction) but then rely on tedious and potentially error-prone conversions between the formats. In music we see this in wanting to work sometimes with absolute pitch and others with relative pitch (a pair of an octave and a pitch within that octave), or choosing between a pair of pitches and a PitchInterval. Also we would like to reuse a function that just works on a pitch to work on a note, which consists of a pitch plus a duration.

For now we have explicity converted between equivalent representations and explictly lifted functions, to get a feel for the amount of work required. However in the world of dependent types there are known research techniques for handling these cases, namely transporting across equivalences as in Homotopy Type Theory [Univalent Foundations Program 2013] and ornaments [Dagand 2017]. Cubical Agda [Vezzosi et al. 2019], although still early in development, should be an excellent tool for exploring the extent to which these research ideas can be applied in a practical context.

Aside from these more fundamental ideas there is simply the work of further extending the formalization of music theory to encompass harmonic analysis, more advanced counterpoint, voice leading, and even composition [Schoenberg et al. 1999]. The results so far have been encouraging, but much more needs to be done to find the right abstractions to express the rules in the simplest, clearest and most composeable way possible. We expect the world of music theory to worthy of a long exploration.

REFERENCES

E. Aldwell and A. Cadwallader. 2018. Harmony and Voice Leading. Cengage Learning.

Youyou Cong and John Leo. 2019. Demo: Counterpoint by Construction. In *Proceedings of the 7th ACM SIGPLAN International Workshop on Functional Art, Music, Modeling, and Design* (Berlin, Germany) (FARM 2019). Association for Computing Machinery, New York, NY, USA, 22â⊠24. https://doi.org/10.1145/3331543.3342578

Pierre-Evariste Dagand. 2017. The essence of ornaments. Journal of Functional Programming 27 (2017), e9. https://doi.org/10.1017/S0956796816000356

W. Bas De Haas, José Pedro Magalhães, Remco C. Veltkamp, and Frans Wiering. 2011. HarmTrace: Improving Harmonic Similarity Estimation Using Functional Harmony Analysis. In Proceedings of the 12th International Society for Music Information Retrieval Conference (ISMIR '11). 67–72.

W. Bas De Haas, José Pedro Magalhães, Frans Wiering, and Remco C. Veltkamp. 2013. HarmTrace: Automatic Functional Harmonic Analysis. *Computer Music Journal* 37:4 (2013), 37–53. https://doi.org/10.1162/COMJ_a_00209

Richard A Eisenberg and Stephanie Weirich. 2013. Dependently typed programming with singletons. ACM SIGPLAN Notices 47, 12 (2013), 117–130.

Johann Joseph Fux. 1965. The Study of Counterpoint. W. W. Norton & Company.

Paul Hudak and Donya Quick. 2018. The Haskell School of Music: From Signals to Symphonies. Cambridge University Press. Hendrik Vincent Koops, José Pedro Magalhães, and W. Bas De Haas. 2013. A Functional Approach to Automatic Melody Harmonisation. In Proceedings of the First ACM SIGPLAN Workshop on Functional Art, Music, Modeling & Design (Boston, Massachusetts, USA) (FARM '13). ACM, 47–58. https://doi.org/10.1145/2505341.2505343

José Pedro Magalhães and W. Bas de Haas. 2011. Functional modelling of musical harmony: an experience report. In *Proceedings of the 16th ACM SIGPLAN International Conference on Functional Programming* (Tokyo, Japan) (*ICFP '11*). ACM, New York, NY, USA, 156–162.

José Pedro Magalhães and Hendrik Vincent Koops. 2014. Functional Generation of Harmony and Melody. In *Proceedings of the Second ACM SIGPLAN Workshop on Functional Art, Music, Modeling & Design (FARM '14)*. ACM. https://doi.org/10.1145/2633638.2633645

Ulf Norell. 2007. Towards a practical programming language based on dependent type theory. Ph.D. Dissertation. Chalmers University of Technology.

Walter Piston and Mark DeVoto. 1987. Harmony. W. W. Norton & Company.

1:10 Anon.

Curtis Roads, John Strawn, Curtis Abbott, John Gordon, and Philip Greenspun. 1996. The Computer Music Tutorial. MIT
 Press, Cambridge, MA, USA.

A. Schoenberg, G. Strang, and L. Stein. 1999. Fundamentals of Musical Composition. Faber & Faber.

- Dmitrij Szamozvancev and Michael B Gale. 2017. Well-typed music does not sound wrong (experience report). In ACM SIGPLAN Notices, Vol. 52. ACM, 99–104.
 - The Univalent Foundations Program. 2013. Homotopy Type Theory: Univalent Foundations of Mathematics. https://homotopytypetheory.org/book, Institute for Advanced Study.
 - Andrea Vezzosi, Anders Mörtberg, and Andreas Abel. 2019. Cubical Agda: A Dependently Typed Programming Language with Univalence and Higher Inductive Types. *Proc. ACM Program. Lang.* 3, ICFP, Article Article 87 (July 2019), 29 pages. https://doi.org/10.1145/3341691