

# Alternative analyses of compensatory base changes in an ITS2 phylogeny of *Corydalis* (Papaveraceae)

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• **Background and Aims** Compensatory base changes (CBCs) that occur in stems of ribosomal internal transcribed spacer 2 (ITS2) can have important phylogenetic implications because they are not expected to occur within a single species and also affect selection of appropriate DNA substitution models. These effects have been demonstrated when studying ancient lineages. Here we examine these effects to quantify their importance within a more recent lineage by using both DNA- and RNA-specific models.

• **Methods** We examined the phylogenetic implications of the CBC process by using a comprehensive sampling of ITS2 from ten closely related species of *Corydalis*. We predicted ITS2 secondary structures by using homology modelling, which was then used for a structure-based alignment. Paired and unpaired regions were analysed separately and in combination by using both RNA-specific substitution models and conventional DNA models. We mapped all base-pair states of CBCs on the phylogenetic tree to infer their evolution and relative timing.

• **Key Results** Our results indicate that selection acted to increase the thermodynamic stability of the secondary structure. Thus, the unpaired and paired regions did not evolve under a common substitution model. Only two CBCs occurred within the lineage sampled and no striking differences in topology or support for the shared clades were found between trees constructed using DNA- or RNA-specific substitution models.

• **Conclusions** Although application of RNA-specific substitution models remains preferred over more conventional DNA models, we infer that application of conventional DNA models is unlikely to be problematic when conducting phylogenetic analyses of ITS2 within closely related lineages wherein few CBCs are observed. Each of the two CBCs was found within the same lineages but was not observed within a given species, which supports application of the CBC species concept.

Key words: Compensatory base change, Corydalis, ITS2, RNA-specific model, secondary structure.

# INTRODUCTION

Many plant systematics studies have effectively used the internal transcribed spacer (ITS) region of rDNA (Álvarez and Wendel, 2003; Feliner and Rosselló, 2007; Qin et al., 2017). Many of these studies have focused on ITS2 for both DNA barcoding and inferring relationships among recently diverged lineages, mainly because of its high information content and ease of amplification (Chen et al., 2010). Despite a rapid rate of nucleotide substitutions, ITS2 has a highly conserved secondary structure throughout Eukaryota (Hershkovitz and Zimmer, 1996; Schultz et al., 2005; Coleman, 2007, 2015), indicating that functional constraints affect ITS2 evolution. This conserved secondary structure can facilitate sequence alignment between divergent taxa by anchoring their conserved motifs and homologous positions, thus improving the accuracy of phylogenetic reconstructions (Kjer, 1995; Keller et al., 2010; Letsch et al., 2010; Zhang et al., 2015, 2016).

The secondary structure of ITS2 is maintained by hydrogen bonds between complementary base pairs, which form the double-stranded regions (stems) of the ITS2 rDNA molecule (Coleman, 2003, 2007). Only six of the 16 possible base pairs occur frequently and are considered to be stable or relatively stable. These are the Watson–Crick pairs GC/CG and AU/UA and the intermediates UG/GU; the remaining ten base pairs are considered mismatches (Rousset *et al.*, 1991; Savill *et al.*, 2001). Substitutions that occur between stable base pairs often decrease the stability of the stems, which is deleterious to RNA function. Compensatory base changes (CBCs), wherein substitutions on the other side, can restore stability (Rousset *et al.*, 1991; Wolf *et al.*, 2013).

This co-variation pattern of stem regions violates the assumption of most phylogenetic inference methods that sites are evolving independently of each other (Posada and Crandall, 1998). Some authors have argued that failing to account for CBC substitutions results in the same variation being counted twice and can lead to misleading phylogenetic inferences with strong support (Wheeler and Honeycutt, 1988; Dixon and Hillis, 1993; Galtier, 2004).

Matthias Wolf and colleagues have effectively improved rDNA sequence alignments and tree searches by directly addressing the CBC process. First, they coded the four bases and their structural states on each side of stems by using 12 nucleotide letters (for paired left, paired right, or unpaired; Seibel *et al.*, 2006; Wolf *et al.*, 2014). This coding enables sequences to be aligned using secondary structure with the program 4SALE (Seibel *et al.*, 2006, 2008). The resulting sequence-structure alignment can then be transferred to ProfDistS (Wolf *et al.*, 2008) for neighbour-joining tree construction and to PAUP\* and R for parsimony and maximum-likelihood tree construction, respectively (e.g. Markert *et al.*, 2012; Heeg and Wolf, 2015). This integrated approach has been shown to improve both accuracy and robustness of phylogenetic analyses relative to application of standard four-state DNA models (Keller *et al.*, 2010; Wolf, 2015; Buchheim *et al.*, 2017).

Some RNA-specific substitution models have been suggested to account for the base-pair substitution together in both stem sides instead of considering the base states separately in each side. These models can be classified as six-state, sevenstate and 16-state models according to their alternative treatments of complementary base pairs (Tillier and Collins, 1998; Savill et al., 2001; Allen and Whelan, 2014). Most widely used programs for phylogenetic inference do not implement these RNA-specific substitution models, though MrBayes (Ronquist et al., 2012) does provide a doublet model. The PHASE package (Jow et al., 2002; Hudelot et al., 2003; Allen and Whelan, 2014) was specifically designed for phylogenetic analyses of RNA and includes RNA-specific substitution models. Application of these RNA models has often demonstrated their superiority over commonly used DNA models based on their shorter inferred branch lengths and higher likelihoods (e.g. Hudelot et al., 2003; Telford et al., 2005; Patiño-Galindo et al., 2018). But other studies have found that using RNA models downweights phylogenetic signal from stems, thereby effectively up-weighting signal from loops (Letsch et al., 2010; Letsch and Kjer, 2011). The loops are more liable to be saturated by multiple hits along individual branches and/or be misaligned. Both of these problems can result in inaccurate phylogenetic inferences (Letsch et al., 2010; Letsch and Kjer, 2011). These results, wherein using RNA-specific models can be both advantageous as well as disadvantageous for phylogenetic inference, come primarily from studies that have sampled ancient lineages for which saturation and/or misalignment are particular concerns. Few studies have quantified the benefit of RNA-specific models in the context of phylogenetic inferences among closely related species (Marinho et al., 2011; Adebowale et al., 2016).

Another potential use of CBCs in ITS2 is species delimitation. Based on her study of ITS2 among species of unicellular green alga, Coleman (2000, 2009) hypothesized that organisms differing by even a single CBC in ITS2 conserved stems are unable to cross. Müller *et al.* (2007) corroborated Coleman's hypothesis based on their large-dataset analyses of fungi and plants. In 93 % of the cases wherein two organisms differed by a CBC in ITS2 they were classified as distinct species (Müller *et al.*, 2007). CBCs in ITS2 were also found to have taxonomic value in some animal lineages. For example, Wolf *et al.* (2007) asserted that *Trichoplax adhaerens*, the simplest known animal species, consists of at least two species based on ITS2 CBC evidence. Likewise, three new species identified using ITS2 CBCs that are morphologically indistinguishable from *Paramacrobiotus richtersi* have been confirmed by using 18S rDNA, physiological and biochemical data (Schill *et al.*, 2010). Based on this evidence, wherein CBCs occur among rather than within species, Wolf *et al.* (2013) developed a generalized 'CBC species concept'.

Corydalis (Papaveraceae) species are often characterized by their large and colourful petal spurs. Hence they may have economic value as ornamentals. However, they are not well known to the public because they often bloom in early spring, have a limited geographical distribution, and are short-lived perennials. Some species with tuberous roots, especially species of section Pes-gallinaceus, are important medical plants in East Asia. Jiang et al. (2018) sequenced the ITS region of some species in section *Pes-gallinaceus*, but found it to be polymorphic. In this study we sampled a clade of 10 Chinese species in section Pes-gallinaceus, including multiple specimens from nine species that were sampled from different geographical regions. We cloned and sequenced the PCR products to identify the ITS2 alleles within polymorphic individuals. We then traced the history of CBC substitutions and tested whether they correspond with species delimitations. Finally, we quantified the effects of alternative substitution models (both conventional DNA models and RNA-specific models) on the inferred phylogeny.

# MATERIALS AND METHODS

# Taxon sampling

The principles that we used for our sampling procedure in order to effectively study CBC evolution are as follows. First, we sampled multiple closely related species to enable us to trace the step-by-step substitution pattern within a single lineage. Second, we sampled multiple individuals from nine of the ten species (a single individual of Corydalis linjiangensis was sampled) to distinguish between apomorphies among species from variation within individual species. We sampled 35 plants from these ten species in Corydalis section Pes-gallinaceus as delimited by the plastid-based phylogeny inferred from Jiang et al. (2018) (Supplementary Data Table S1). Corydalis huangshanensis, from the sister section (Duplotuber), was used as the outgroup for comparisons between DNA- and RNA-specific models. Eleven additional species from Pérez-Gutiérrez et al. (2015) were added to calibrate node ages for the molecular dating analysis (Supplementary Data Table S1).

## DNA extraction, amplification and sequencing

Genomic DNA was extracted from silica gel-dried leaves following a modified CTAB protocol (Porebski *et al.*, 1997) and then purified with Plant DNA Extraction Kits (Tiangen Biotech, Beijing, China). The PCR amplifications were carried out with primer pair ITS2F and ITS3R (Hou *et al.*, 2013). PCR reactions in a 25  $\mu$ L volume included 40–100 ng of DNA template, 2.5  $\mu$ L of 2.5 mM of each dNTP, 2.5  $\mu$ L of 10× PCR buffer, 0.5  $\mu$ L of 10  $\mu$ M of each primer, and 0.625 U of Taq polymerase. The PCR program setting was as follows: 94 °C for 4 min; 35 cycles of 94 °C for 30 s, 53 °C for 30 s and 72 °C for 60 s; followed by an extension period of 72 °C for 10 min. We cloned PCR products by using the pUCm-T carrier system. At least eight clones per individual were sequenced with the primer M13 (-48) on an ABI 3730XL sequencer (Applied Biosystems, Foster City, CA, USA).

## Secondary-structure prediction and partition

ITS2 boundaries were identified by using hidden Markov models implemented in the ITS2 Ribosomal RNA Database (http://its2.bioapps.biozentrum.uni-wuerzburg.de/; Ankenbrand et al., 2015). The secondary structure (Vienna format) of ITS2 was obtained via homology prediction using the most similar sequence with a modelled structure in the database (Selig et al., 2008). 4SALE (Seibel et al., 2006, 2008) was developed to both align sequences and associate secondary structures simultaneously for subsequent sequence-structure and phylogenetic analyses (e.g. Keller et al., 2010; Markert et al., 2012; Wolf et al., 2014; Heeg and Wolf, 2015). Alternatively, in this study we used 4SALE to generate the consensus secondary structure of our dataset after sequence structures had been aligned and manually refined. This consensus secondary structure provides an accessible and informative visualization of the structural information contained in the alignment (Seibel et al., 2008) (Fig. 1). We partitioned the ITS2 primary sequence into paired and unpaired regions, and analysed them both separately and in combination in



FIG. 1. Consensus ITS2 secondary structure derived from *Corydalis* species. The four stems are labelled I–IV. The pyrimidine–pyrimidine (C) bulge in stem II, the UGGU in stem III and the high A content between stems that are common to nearly all angiosperms are indicated in red colour. CBCs and hemi-CBCs (H1–3) distributed in the stems are highlighted in black solid boxes and coloured dashed boxes, respectively. Degree of conservation over the entire alignment is displayed in colour grades from green (conservative) to red (variable).

order to test whether the following variables differed between them. Nucleotide composition and variation, the ratio of transitions to transversions (Ts/Tv) and genetic distances were calculated using MEGA 7 (Kumar *et al.*, 2016). Parsimonyinformative sites were identified using PAUP\* 4.0b10 (Swofford, 2003). Levels of homoplasy were compared between paired and unpaired regions using the substitution-saturation test implemented in DAMBE5 (Xia, 2013).

#### Phylogenetic analyses of ITS2 using DNA substitution model

Two sets of alignments and phylogenetic analyses were performed. The first set relied strictly upon DNA sequences and models without reference to RNA secondary structure or RNAspecific models. The second set used both RNA secondary structure and RNA-specific models.

The first set of alignments and phylogenetic analyses were performed as follows. The complete ITS2 nucleotide sequences were aligned using a purely sequence-based method (G-INS-i), which is the most accurate iterative refinement method in MAFFT that does not take into account secondary structure (Katoh and Toh, 2008). Gaps were treated as missing data rather than coded as separate characters (Simmons and Ochoterena, 2000) in order to make the DNA-specific analyses directly comparable to the RNA-specific analyses (PHASE, which was used for the RNA-specific analyses, cannot analyse gap characters). Parsimony analysis was performed using PAUP\* 4.0b10 (Swofford, 2003) with the following settings: heuristic search of 1000 random-addition replicates; tree-bisection-reconnection branch swapping and up to 5000 trees saved; 1000 bootstrap replicates with ten heuristic searches per replicate.

Alternative models of nucleotide substitution were examined using jModeltest 2.1.7 (Darriba et al., 2012). The bestfit model selected using the Akaike information criterion (AIC; Akaike, 1974) was GTR+G, which was then used for maximum likelihood (ML) analysis in PhyML 3.0 (Guindon et al., 2010). Non-parametric bootstrap values were then computed from 1000 pseudoreplicates with both nearest-neighbour interchange (NNI) and subtree-pruning-regrafting (SPR) tree searches. Bayesian inference (BI; Yang and Rannala, 1997) was implemented in MrBayes 3.2 (Ronquist et al., 2012) using the GTR+G model and Prset statefreqpr=dirichlet (1,1,1,1), which was selected as the best-fit model by MrModeltest 2.3 (Nylander, 2004). Two independent runs with four Markov chain Monte Carlo (MCMC) chains were each performed for 1 000 000 generations with trees every 100 generations. The initial 3000 sampled trees were discarded as burn-in. Convergence of the two Bayesian MCMC runs was verified by examining effective sample sizes (>200) for each parameter estimate in Tracer 1.6 (http://tree.bio.ed.ac.uk/software/tracer/). We also determined topological convergence based on split frequencies and tree distances by using RWTY (Warren et al., 2017).

# Molecular dating

In order to infer ages of CBCs, we used a Bayesian relaxedclock method as implemented in BEAST 1.7.5 (Drummond et al., 2012). Because of the lack of reliably identified fossils within Corvdalis, we used a molecular chronogram of subfamily Fumarioideae (Papaveraceae) estimated by Pérez-Gutiérrez et al. (2015), from which we set the crown age of Corydalis at 37.73 mya, with a 95 % highest posterior density (HPD) of 27-49 mya. Likewise, the crown age of the sister group of Corvdalis was set at 33.33 mya (95 % HPD 24-43.5 mya).We performed the BEAST analysis using the GTR+G model, four-category gamma-shaped distribution and a Yule speciation process as a prior to model the tree. The MCMC analysis was run for 10 000 000 generations, sampling every 1000 generations, with a burn-in of 3000 (30 %) trees. The log file was examined using Tracer 1.6 to check that effective sample size was >200 for chain convergence. A final tree generated using TreeAnnotator 1.7.5 (Drummond et al., 2012) was viewed and edited using Figtree 1.5.4 (http://tree.bio.ed.ac.uk/ software/figtree/).

#### Phylogenetic analyses of ITS2 using RNA substitution models

To facilitate comparison of base-pair information and thereby infer the CBC substitution history, we coded each base pairing and transformed them into comparable characters using our modified software RNAconvert from RNAstat (Subbotin et al., 2007). Both softwares can generate a multiple alignment using secondary structure, while RNAconvert can further separate the conversion into a paired partition and an unpaired partition (Supplementary Data Fig. S1). In order to display basepair variation and thus detect CBCs and hemi-CBCs (one-sided substitutions before CBCs), we aligned paired sites in the transformed matrix using MAFFT and then adjusted manually while referring to the secondary-structure information. Unlike the commonly used CBCAnalyzer (Wolf et al., 2005), this method of structure-guided alignment following base-pair conversion shows both the number of CBCs and the base-pair state of each site (Supplementary Data Fig. S1). More importantly, we can map each base-pair state in the phylogenetic tree to trace the CBC process.

We performed BI analysis using PHASE package 3.0 (Allen and Whelan, 2014). The best-fitting models for BI analyses were estimated using a Perl script (model\_selection.pl) from PHASE. This Perl script includes both DNA models (HKY85 and REV) and RNA models (seven RNA seven-state models, wherein the ten mismatch base pairs have a single frequency parameter, and nine RNA 16-state models). We used Allen and Whelan's (2014) likelihood-correction method to account for different numbers of parameters between the four-, seven-, and 16-state models. The best-fit models (REV+G for unpaired regions and RNA16D+G for paired regions) were then used for the phylogenetic analyses. We used the optimal known ML tree topology from PhyML as the input tree for this procedure. Phylogenetic analyses were performed using the mcmcPHASE program from the PHASE package. The MCMC analysis was run for 1 000 000 generations, sampling every 100 generations, with a burn-in of 3000 (30 %) trees. After convergence had been verified by using Tracer 1.6 (effective sample size >200), a consensus tree with posterior probabilities, base-pair frequencies and substitution rate parameters was generated using the mcmcsummarize program from the PHASE package.

### RESULTS

## Sequences and secondary-structure analyses

Direct sequencing of ITS amplicons indicated multiple alleles in some individuals. Subsequent cloning confirmed the ITS2 polymorphism in Corydalis. Five individuals sampled from four species each contained three to nine alleles. A total of two to 17 alleles were identified in each ingroup species except C. linjiangensis, for which a single specimen was sampled (Supplementary Data Table S1). The length of ITS2 ranged from 218 to 239 bp, with an average of 133 bp from paired regions and 90 bp from unpaired regions. Nucleotide composition varied between the paired and unpaired regions. For example, the average G+C content in the paired regions (82 %) was greater than that in unpaired regions (54 %), while the adenine content in the unpaired region was 4.4-fold higher than that in the paired region (Table 1). Their substitution pattern was also different. For example, the Ts/Tv ratio was higher in paired than in unpaired regions, while the unpaired regions were more variable than the paired regions. Given that 60 % of the ITS2 bp are involved in stem pairing together with these differences in nucleotide frequencies, Ts/Tv ratios and variation, structural-partition and paired-sites models may be more appropriate for the ITS2 region than standard nucleotide models. The substitution saturation test indicated that neither the paired nor the unpaired ITS2 regions were saturated (Supplementary Data Table S2).

The consensus ITS2 secondary-structure model had four stems (helices), of which stem III was the longest and had a UGGU motif while stem II contained a pyrimidine–pyrimidine bulge and the loop between stems had a pronounced adenine bias (Fig. 1). All of these are common features of ITS2 among angiosperms (Coleman, 2003). The greater G/C content and GC base pairing in the stem regions help maintain the supporting scaffold.

#### Model test and substitution analyses of base-pair interaction

There are a total of seven RNA seven-state models (7A–G) and nine RNA 16-state models (16A–F, 16I–K) according to the

 
 TABLE 1. Comparison of sequence characteristics and phylogenetic information between different regions of ITS2

Category	Paired regions	Unpaired regions	All regions
Mean length (bp)	133	90	223
Aligned length	134	119	253
A/T/C/G content (%)	8/10/40/42	35/12/42/12	19/11/41/30
Ts/Tv	1.63	0.87	1.58
MCL Ts/Tv	19.93	0.67	1.10
No. of VCs (%)	65 (48.5 %)	72 (60.5 %)	137 (54.2 %)
No. of PICs (%)	42 (31.3 %)	56 (47.1 %)	98 (38.7 %)

MCL, maximum composite likelihood method (Tamura *et al.*, 2007); VC, variable character; PIC, parsimony-informative character.

naming convention of Allen and Whelan (2014), among which the most parameterized models are 7A and 16A, respectively. The remaining 14 models are derived from 7A or 16A with different parameter constraints (Savill et al., 2001; Allen and Whelan, 2014). The best-fit substitution model was REV+G RNA16D+G (REV+G for unpaired regions and RNA16D+G for paired regions) according to the AIC. The best-fit conventional DNA substitution model (GTR+G) had a higher AIC value than the REV+G RNA16D+G model (Supplementary Data Table S3), which corroborates our expectation that nonindependent base-pair substitutions have occurred in ITS2 within the study lineage.

Early RNA six-state models, which treat mismatch (MM) pairs as missing data, are not considered in Allen and Whelan's (2014) model-test method. Our base-pair statistics indicate that the total mutability (43.02) and frequency (9.31 %) of MM pairs are greater than those of GU/UG states (4.74/8.06 %; Supplementary Data Table S4), indicating that MM pairs should not be neglected. We therefore adopted Allen and Whelan's (2014) method and focused on the RNA16 and RNA7 series models in this study.

The best-fit model for paired regions, RNA16D, was developed specifically to account for GU/UG frequencies that are low relative to Watson-Crick base pairs, but still greater than MM (Savill et al., 2001). Compared with the earlier RNA models, this model includes an extra frequency parameter and does not allow simultaneous substitution of both nucleotides in a base pair. For example, the GC base pair can only change at one site at a time to six possible base pairs (GU, GA, GG; CC, UC, AC; Supplementary Data Table S4). The parameter estimates obtained from RNA16D+G can provide insight into the ITS2 substitution process for paired regions. The equilibrium frequency of stable Watson-Crick base pairs is 83 %, with the remaining base pairs being 8 % wobble GU/UG base-pairs and 9 % unstable MM. Substitutions from unstable to stable base pairs always occurred at higher rates. By summing across each row in Supplementary Data Table S4 we obtained the net rate of change from one base pair to the others ('mutability'). We found that GC/CG had the highest frequency but the lowest mutability. In contrast, MM had the lowest frequency but the highest mutability. These base-pair frequency, mutation rate and mutability results all indicate that natural selection was acting to maintain ITS2 secondary structure. Yet the moderate (9 %) frequency of the MM state indicates that mismatches can be tolerated to some extent and do not completely disrupt the secondary structure.

In addition to examining individual rates between pair states, we also binned base pairs following Higgs (2000), which allows double transitions between Watson–Crick pairs  $(r_{i})$ , double transversions between Watson–Crick pairs  $(r_{y})$ , a single transition from Watson-Crick pairs to GU/UG (forward rates,  $r_{\rm c}$ ) and a single transition from GU/UG to Watson–Crick pairs (backward rates,  $r_{\rm b}$ ; Fig. 2). Our results indicate an absence of double substitutions between Watson–Crick pairs  $(r_d/r_y = 0)$ , such that CBC substitutions proceeded only by the two-step mutation mechanism via the GU/UG intermediate. But the GU/ UG intermediate quickly changed to Watson-Crick pairs, and thus  $r_{\rm b}$  is about four times higher than  $r_{\rm f}$  (Supplementary Data Table S4).



FIG. 2. Schematic representation of substitution rate parameters.  $r_{1}$  represents double transitions between Watson-Crick pairs;  $r_v$  represents double transversions between Watson-Crick pairs;  $r_{f}$  represents a single transition from Watson–Crick pairs to GU/UG; and  $r_{\rm b}$  represents a single transition from GU/UG to Watson-Crick pairs. The thickness of the arrows indicates the sub-

# stitution rates according to Supplementary Data Table S4.

#### Analyses of CBC substitution process in a phylogenetic context

A total of 65 ITS2 alleles were observed in the 11 species that we sampled. From these alleles two CBCs and 18 hemi-CBCs were identified (Table 2). Three types of hemi-CBC were found in the stems. The most frequent was  $UG \rightarrow CG$ , followed by  $GU \rightarrow GC$  and  $GU \rightarrow AU$ . Hemi-CBCs were observed in all four stems. The longest stem (III) had the highest number of hemi-CBCs. The two CBCs occurred in stem I.

Two CBCs were inferred in the gene tree (Figs 3 and 4). A CBC from CG to UG and then UA is shown in Fig. 3. No individual species was found to have all three of these CBC states. The intermediate UG state is shared by six species, including three species that also have the UA state.

A second CBC, from UA to UG and then CG, was also observed (Fig. 4). Unlike the first CBC, the CG state was observed in a single species (C. linjiangensis) within the clade of Corydalis that encompasses the complete CBC. The inferred intermediate UG state was observed in the form of a U-deletion on one side of the stem in six individuals of Corydalis ambigua and Corydalis fumariifolia. The CG state was also observed in three early-derived Corydalis species.

The molecular dating results indicate that the most recent common ancestor of the CG and UG species for the first CBC (Fig. 3) occurred ~ 28.5 mya (95 % HPD 19.6–35.7 mya), the crown age of species with the UG state occurred ~25.3 mya (the 95 % HPD was unavailable from BEAST), and stem and crown nodes for the UA species occurred ~14.9 mya (95 %

HPD 10.4–26.1 mya) and ~13.0 mya (95 % HPD 7.7–20.8 mya), respectively (Supplementary Data Fig. S2). Based on the optimal age estimates, we infer that the CBC substitutions were separated by ~10.4–15.5 my.

ITS2 phylogenetic trees derived from DNA/RNA models

The ITS2 matrix was first analysed using conventional four-state DNA models, for which the GTR+G model fitted best. This model was then used in the subsequent ML, BI and BEAST analyses. The maximum parsimony (MP) tree was also constructed for comparison. There were many polytomies in the strict consensus MP tree, but four of the six focal clades (A–F in Fig. 3) were consistently resolved by all optimality criteria applied. The exceptions are clades D and E, which were contradicted in the MP consensus tree because all four individuals of *Corydalis turtschaninovii* were resolved as a clade sister to clade B with 57 % bootstrap support.

We observed a diversity of ITS2 alleles in 11 *Corydalis* species. Of the ten species for which two or more alleles were sampled, these alleles were not resolved as exclusive lineages for six species. Alleles from three of these six *Corydalis* species (*C. ambigua*, *C. caudata* and *C. humilis*) were divided into two clades (A and B in Fig. 3) together with other *Corydalis* species. Based on these results, wherein alleles from each of three species are polyphyletic and separated into two well-supported clades that are on long branches (Supplementary Data Fig. S2), we hypothesize that these divergent ITS2 alleles from the same species are the result of hybridization. Although the ITS2 gene tree did not fully resolve phylogenetic relationships among the sampled species, it was sufficient to infer the CBCs.

We compared the BI trees produced by the optimal DNAand RNA-specific alignments and models (Fig. 5). The two trees were generally topologically consistent with each other (the only contradiction is the resolution of *C. turtschaninovii*), though the DNA tree was generally more resolved and provided higher support for clades consisting of alleles from two or more species. We found 13 different support values for clades above the species level between the two trees, among which four clades (#A) were resolved only in the DNA tree and three clades (#B) were resolved only in the RNA tree. We identified eight identical clades consisting of alleles from two or more species. Four of these clades (#3, #5, #7 and #8) had equal or similar support values, whereas the remaining four clades were more highly supported in the DNA tree. In contrast, the RNA tree was generally more resolved (four unique clades, \*1-\*4) and provided higher support for clades consisting of alleles from a single species.

# DISCUSSION

## Mutational dynamics of ITS2 in terms of secondary structure

Since ITS2 secondary structure is crucial to the process of prerRNA maturation (Coleman, 2015), one of our concerns is how selective constraint acts on this functional secondary structure. All ITS2 sequences in our study appear to be functional copies because they all have the conserved 'four-fingered hand' form (Coleman, 2003) and have common core motifs that are conserved within angiosperms (Hershkovitz and Zimmer, 1996; Coleman, 2003, 2007). A consensus RNA secondary structure is a prerequisite for phylogenetic analyses that apply RNA models. We found that the paired region had a high G/C content whereas the unpaired region had a high A/C content. In addition, the GC/CG base pair had the highest frequency but the lowest mutability among all base pairs. These observations support the hypothesis that functional rRNA sequences are selected to increase their structural and thermodynamic stability (Higgs, 2000).

Coleman (2003, 2007) showed that nucleotide sequences evolve more slowly in helices II and III than helices I and IV, which is expected given their crucial function in rRNA transcript processing (Coleman, 2015). In our dataset, the two identified CBCs occurred in the more variable helix I, whereas hCBCs were found across all four helices. Despite the greater nucleotide variability in helix I, the CBCs maintained its functional stability. A key feature of the compensatory substitutions is the directionality. For example, we found that UA base pairs changed most frequently to UG base pairs than to UC or UU base pairs (Supplementary Data Table S4). This rate difference can be interpreted as indicating that, when UA changes to CG, it occurs most frequently via a relatively stable UG intermediates (Fig. 2) rather than GU or the unstable UC or UU intermediates.

# Phylogenetic implications of CBC

The CBC mutation pattern of paired regions violates the siteindependence assumption of typical phylogenetic analyses. Application of RNA-specific models is thus theoretically justified but still largely confined to studies of ancient lineages

TABLE 2. Type and distribution of CBCs and hemi-CBCs in stems of the consensus ITS2 secondary structure

Substitution (number)	Stem (length)	Base change (type)	Number of each type in stem/ITS2	Total number of types in stem
Hemi-CBCs (18)	I (13)	UG→CG (H1)	4/10	4
	II (10)	$UG \rightarrow CG (H1)$	2/10	3
		$GU \rightarrow GC (H2)$	1/7	
	III (36)	$UG \rightarrow CG(H1)$	2/10	8
		$GU \rightarrow GC (H2)$	5/7	
		$GU \rightarrow AU (H3)$	1/1	
	IV (8)	$UG \rightarrow CG(H1)$	2/10	3
		$GU \rightarrow GC (H2)$	1/7	
CBCs (2)	I (13)	$CG \rightarrow UA(C1)$	1/1	2
		UA→CG (C2)	1/1	



FIG. 3. A CBC substitution process mapped onto the ITS2 maximum likelihood tree, with different CBC states indicated using different branch colours. Alleles from the same species are assigned the same colour for their terminal names. Numbers on the branches indicate  $\geq$ 50 % support for MP (bootstrap), ML (bootstrap) and BI (posterior probabilities). ML and BI analyses are based on the GTR+G model. Numbers following a species name represent voucher and clone numbers. Clades A and B share three species with distinct alleles; Clades A–C and F are all supported in MP/ML/BI trees, whereas clades D and E are only supported in ML/BI trees.

(e.g. Hudelot et al., 2003; Mallatt et al., 2010; Letsch and Kjer, 2011; Allen and Whelan, 2014; Patiño-Galindo et al., 2018). To date, few studies have critically assessed to what extent this co-variation pattern will affect the phylogenetic inference among recently diverged lineages (Marinho et al., 2011; Adebowale et al., 2016). In this study we inferred the ITS2 gene tree among closely related species by using both DNA and RNA models as well as tracing the CBC process, as suggested by Caisová et al. (2011). The strong nucleotide composition bias between paired and unpaired regions and the higher likelihoods for DNA/RNA models over DNA-only models (Supplementary Data Table S3; but note that this comparison is confounded by our use of different alignments) are in agreement with the previous analyses that allowed RNA loops and stems to evolve under separate models (Telford et al., 2005; Biffin et al., 2007; Allen and Whelan, 2014).

The better fit of RNA-specific models to our data and the three additional clades in the RNA topology both indicate advantages to using this model instead of typical DNA models. Yet the DNA-model-based topology was largely consistent with the RNA-model-based topology and included several clades that were either novel or more highly supported than in the RNAmodel-based tree (Fig. 5). Although application of a typical DNA model to RNA stems can violate the site-independence assumption, this assumption is only severely violated in the context of CBCs rather than other substitutions, such as hemi-CBCs. Indeed, of the 20 compensatory changes in paired regions that we identified only two CBCs (Table 2), accounting for no more than 3 % of the variable characters in the entire matrix (Table 1). Therefore, the empirical effect of the siteindependence violation is minimal in the context of this study of closely related species, in contrast to the more severe effects that have been demonstrated in phylogenetic analyses of more ancient lineages (Jow et al., 2002; Hudelot et al., 2003; Letsch et al., 2010; Mallatt et al., 2010; Patiño-Galindo et al., 2018). Application of RNA models is useful for improving alignment and inferring the process of molecular evolution. But based on our results we do not consider application of these models to be



FIG. 4. The other CBC substitution process mapped onto the ITS2 ML tree with different CBC states indicated using different branch colours. Alleles from the same species are assigned the same colour for their terminal names. Numbers on the branches indicate ≥50 % support for MP (bootstrap), ML (bootstrap) and BI (posterior probabilities). ML and BI analyses are based on the GTR+G model. Numbers following a species name represent voucher and clone numbers. One side (U) of the expected intermediate UG base pair that was missing in sequences represents an '?G' base pair. Clades A and B share three species with distinct alleles; Clades A–C and F are all supported in MP/ML/BI trees, whereas clades D and E are only supported in ML/BI trees.

necessary for effective phylogenetic inference among closely related species using ITS2. The generality of our results and inference should be tested in other empirical studies.

# CBC analyses and species delimitation

A highlight of this study is identification of each step of the CBC substitution process in *Corydalis*. We did not observe the entire CBC process within any individual *Corydalis* species, which supports the 'CBC species concept' hypothesis (Wolf *et al.*, 2013). Although the CBC species concept may be used to help identify distinct species, one should not expect CBCs to differentiate all species from each other. In our study, we generally observed at least two species that shared the same state in a base pair that included a CBC (Figs 3 and 4). Some recent studies in chlorophytes (Caisová *et al.*, 2011, 2013) and Cymatosirales (Samanta *et al.*, 2018) also found that CBCs most often correspond to supra-specific divergence rather than individual species.

Likewise, in blowflies CBCs were not found in 33 % of congeneric species pairs (Marinho *et al.*, 2011); CBCs are also absent in four distinct species of *Strychnos* (Adebowale *et al.*, 2016).

Identification of each stage in a CBC remains problematic in practice. In most phylogenetic studies, wherein a single sequence represents an entire species, low-frequency base-pair states are generally not observed. If taxon sampling is insufficient, some base-pair states will be lost in CBC analyses. Given sufficient intraspecific and interspecific sampling, as in this study, the entire CBC process may be directly inferred within an individual lineage rather than relying upon indirect statistical methods.

### Conclusions

In this study we inferred the ITS2 gene tree among closely related species by using both conventional DNA as well as RNA-specific models, and then traced the CBC process on the inferred tree. By doing so we identified just two CBCs, both in



FIG. 5. Comparison of BI trees inferred from different substitution models and alignments. (A) BI tree inferred using the DNA model GTR+G. (B) BI tree inferred using the RNA-specific model REV+G\_RNA16D+G. Numbers on the branches indicate the Bayesian posterior probabilities (>50). Corresponding clades of the two trees that shared the same alleles from two or more species are marked with # and number; clades with >50 posterior probability that are resolved only in the DNA or RNA tree are marked with #A and #B, respectively. Additional intraspecific resolution in tree B is indicated using asterisks (\*) and numbers. Numbers following a species name represent voucher and clone numbers.

the most variable stem (stem I) via GU/UG intermediates, and showed that a pair of CBC substitutions may be separated by ~10.4–15.5 my. Neither of the CBCs occurred within any given species, which is consistent with application of the CBC species concept. ITS2 clearly evolved under secondary-structure constraints within the study lineage. Yet application of conventional DNA models appears unlikely to be problematic when conducting phylogenetic analyses of ITS2 within such closely related lineages, wherein few CBCs are observed. The generality of these results and inferences should be tested in other empirical studies of recently diverged lineages.

# SUPPLEMENTARY DATA

Supplementary data are available online at https://academic. oup.com/aob and consist of the following. Figure S1: workflow illustrating how base-pair information is transformed into an alignment. Figure S2: molecular chronogram showing the divergence times of each substitution in the CBC process. Table S1: list of sample information used in this study. Table S2: substitution-saturation test for different ITS2 partitions. Table S3: comparison of likelihood scores between DNA- and RNA-specific models applied to the ITS2 alignments. Table S4: best-fit substitution rate matrix, mutabilities, base-pair frequencies and substitution rate parameters for the ITS2 paired region in *Corydalis*, inferred using the RNA16D+G model.

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