pr2-primers: an 18S rRNA primer database for protists

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## Abstract

Metabarcoding of microbial eukaryotes (collectively known as protists) has developed tremendously in the last decade, almost solely relying on the 18S rRNA gene. As microbial eukaryotes are extremely diverse, many primers and primer pairs have been developed. To cover a relevant and representative fraction of the protist community in a given study system, an informed primer choice is necessary, as no primer pair can target all protists equally well. As such, a smart primer choice is very difficult even for experts and there are very few on-line resources available to list existing primers. We built a database listing 285 primers and 83 unique primer pairs that have been used for eukaryotic 18S rRNA gene metabarcoding. In silico performance of primer pairs was tested against two sequence databases: PR<sup>2</sup> version 4.12.0 for eukaryotes and a subset of SILVA version 132 for bacteria and archaea. We developed an R-based web application enabling browsing of the database, visualization of the taxonomic distribution of the amplified sequences with the number of mismatches, and testing any user-defined primer or primer set (https://app.pr2-primers.org). Taxonomic specificity of primer pairs, amplicon size and location of mismatches can also be determined. We identified universal primer sets that matched the largest number of sequences and analysed the specificity of some primer sets designed to target certain groups. This tool enables guided primer choices that will help a wide range of researchers to include protists as part of their investigations.

## Introduction

Microbes are key players in all Earth ecosystems. Among them are protists that encompass all unicellular or unicellular-colonial eukaryotes, excluding some fungi. Protists perform a range of functions from photosynthesis to organic matter degradation. Although some eukaryotic groups such as unicellular algae (e.g. phytoplankton) have a long tradition of being studied as key players in marine primary production, the importance of protists in other processes and other environments has only been recently recognized, for example their role in nutrient cycling in soils or as symbionts and phagotrophs in marine waters (Geisen et al. 2018a; Worden et al. 2015). This late recognition stems in part from the inherent difficulties of visually identifying them and growing them in culture. In recent years, the development of metabarcoding has provided new tools to study protist diversity and ecology.

Metabarcoding is defined (Taberlet et al. 2012) as the use of a specific marker gene to analyse the composition of natural communities in a specific environment (water, soil, animal gut, faeces, etc...). After DNA extraction, the gene is amplified using a pair of primers targeting one specific region, samples are labelled with molecular tags and the resulting DNA is sequenced using a high throughput technology, mostly Illumina currently. This approach was initially developed for bacteria (Sogin et al. 2006) and expanded later for protists (Amaral-Zettler et al. 2009; Stoeck et al. 2009). The gene most commonly used is the small sub-unit ribosomal RNA gene (SSU rRNA: 16S rRNA for archaea and bacteria, 18S rRNA for eukaryotes). The SSU rRNA gene is composed of conserved regions that can be used to design general primers and variable regions (V) that can be used to assign taxonomy and design specific probes. In bacteria, the regions targeted are very often V3/V4 or V4/V5 (Parada et al. 2016), although other regions have been suggested as providing better resolution (e.g. Bukin et al. 2019). For eukaryotes, two variable regions of the 18S rRNA gene have mostly been targeted, the V4 and V9 regions: the V4 region is located in the second quarter of the 18S rRNA gene and the V9 region at the end of the 18S rRNA gene, near the internally transcribed spacer (ITS) region. Initially, the V9 region was favoured because of the limitation in sequence size (Amaral-Zettler et al. 2009; Stoeck et al. 2009): for example, initially Illumina sequences were restricted to 2x75 bp. However, with the development of the Illumina MiSeq (up to 2x300 bp), the V4 region is now preferred, in particular because it is longer, more variable, and better covered in reference databases (Pawlowski et al. 2012). Other eukaryotic genes, and in particular the mitochondrial cytochrome oxidase 1 gene (COI or cox1), have been used for Metazoa (Valentini et al. 2009) but their use is debated in particular because of the lack of universal primers (Andújar et al. 2018; Deagle et al. 2014) and the absence of this gene in lineages that have lost the mitochondrial genome (e.g. Yahalomi et al. 2020). For protists, the 18S

rRNA gene appears to be most appropriate as a general marker (Pawlowski et al. 2012), although other genes such as rbcL (large unit of the RUBISCO) have been used for targeting photosynthetic organisms (e.g. Pujari et al. 2019).

Primer selection is critical to obtain an accurate taxonomic profiling of protist communities. Each primer (forward and reverse) must amplify the target community with minimal biases. The region amplified must be long enough to differentiate between closely related taxa by including enough variable positions. It should also be preferably short enough to be fully sequenced by the chosen technology, although longer amplicons can be also be partially sequenced. With Illumina sequencing being now the preferred technology, amplicon size must be ideally (although this is not absolutely necessary, see Lambert et al. 2019; Needham and Fuhrman 2016) about 50 bp smaller than the sum of the forward and reverse sequences (called R1 and R2) to allow enough overlap to reconstruct the complete amplicon: for example, the Illumina MiSeq 2x300 bp chemistry can sequence amplicons of up to 550 bp. A large diversity of primer and primer sets targeting the 18S rRNA gene have been developed over the years, although a few dominate in protist metabarcoding studies. Few resources are available that list eukaryotic 18S primers and primer pairs, provide information on their taxonomic specificity and allow testing of new primer pairs. Most existing primer databases do not focus on protists. For example, the primer database linked to the Barcode of Life Data System website Bold Systems (https://boldsystems.org/index.php/Public Primer PrimerSearch) focuses on metazoans, and Probebase (http://probebase.csb.univie.ac.at/node/8, Greuter et al. 2016) focuses on bacteria. A few programming tools have been developed to test primer set specificity, for example EcoPCR (Ficetola et al. 2010), a Python program, or R libraries such as PrimerMiner (Elbrecht and Leese 2017). The phylogenic program ARB offers a function to design and test probes and primers (Ludwig 2004). Unfortunately, these tools need to be installed in a specific computing environment and require some background programming skills. Many existing online tools such as Probematch (https://rdp.cme.msu.edu/probematch/search.jsp) only allow testing primer sets against bacteria, archaea and fungi. Silva TestPrime (https://www.arb-silva.de/search/testprime) is the only tool that covers protists. It provides very detailed feedback on the taxonomy of amplified sequences, and the location of mismatches. Such detailed information comes at the expense of speed, with a typical test needing a few minutes to run. Moreover, the taxonomic annotation of the Silva database for protists is not optimal at this time, particularly for environmental sequences which are often only assigned at the class level or above (typically "Chrysophyceae; uncultured; eukaryotic picoplankton environmental sample").

To fill this gap and to provide protist researchers with a usable tool, we constructed a database

of primers and primer sets used for eukaryotic 18S rRNA metabarcoding. These primer sets were tested *in silico* against the PR<sup>2</sup> database (Guillou et al. 2013) that contains more than 180,000 18S rRNA sequences with expert taxonomical annotation and a subset of the Silva database for archaea and bacteria. We developed an R-based web application that allows exploration of the database, to visualize pre-computed *in silico* amplification results according to taxonomy (% of amplification, size of amplicons and location of mismatches), and to test any user-defined primer set.

## Material and Methods

18S rRNA gene primers (Table S1) and primer sets (Table S2) used in metabarcoding studies were collected from the literature. Primer sequences and primer sets (knowing that several primer sets may share at least one primer) were stored in a MySQL database. Primer sets were tested by performing in silico amplification of eukaryotic sequences stored in the PR<sup>2</sup> reference database (Guillou et al. 2013) version 4.12.0 (https://github.com/pr2database/pr2database/releases/tag/v4.12.0). We also used a small subset of the Silva database version 132 provided by the mothur website (https://mothur.org/wiki/silva\_reference\_files) containing 8517 bacteria and 147 archaea sequences to test whether these two groups were amplified. Database sequences with ambiguities were discarded (any nucleotide that is not A, C, G or T). Sequences with length shorter than 1350 bp were not considered except for the V4 region, for which this threshold was lowered to 1200 bp, since most sequences in PR<sup>2</sup> contain the V4 region. In contrast, this limit was extended to 1650 for the V9 region and since many 18S rRNA do not cover the full V9 region, we only kept sequences that contained the canonical sequence GGATC[AT] which is located at the end of the V9 region, just before the start of the internally transcribed spacer 1 (ITS1). An R (R Development Core Team 2013) script using the Biostrings package (Pagès et al. 2020) was used to compute the number of mismatches to the forward and reverse primers, allowing for a maximum of 2 mismatches for each primer using the function matchPattern with the following parameters: max.mismatch=2, min.mismatch=0, with indels=FALSE, fixed=FALSE, algorithm="auto". We computed the position of mismatches using the mismatch function with parameter fixed=FALSE. A faster version of the script is also available that does not compute mismatch position using the vectorized form of the matchPattern function (*vmatchPattern*). The latter function is used in the Shiny application (see below) allowing users to test their own primer or primer sets. The data were tabulated using the dplyr package and plotted using the ggplot2 package (Wickham 2016). An R shiny application to interact with the database was developed using the following R packages: shiny, shinyFeedback and shinycssloaders (Sali and Attali 2020).

## Results and Discussion

### Database of primers and primer sets

We were able to recover a total of 108 general eukaryotic primers and 177 primers specific to some taxonomic groups from the literature (Tables 1 and S1, https://app.pr2-primers.org). Some of these primers were designed early on when researchers began to amplify and sequence the 18S rRNA gene (e.g. Medlin et al. 1988). More recently, researchers have been designing primers specific to some taxonomic groups, mostly targeting phylum level (e.g. S19F and S15rF for Foraminifera, Morard et al. 2011) or class level (e.g. primer PRYM03+3 for Prymnesiophyceae, Egge et al. 2013). Some primers were also designed to block specific taxa (e.g. 18SV1V2Block against the coral *Pocillopora damicornis*, Clerissi et al. 2018) to be used in combination with more general primers (18SV1V2F in this case) or to avoid amplification of some groups (e.g. EUK581-F and EUK1134-R which do not amplify Metazoa, Carnegie et al. 2003). "Anti-metazoan" primers are used when looking at the eukaryotic microbiome of eukaryotic organisms (e.g. corals, oysters) to avoid amplification of host's genes (Bass and del Campo 2020).

We identified a total of 83 unique primer sets (pairs) that have been used in metabarcoding studies (Table S2). Not all primers have been used for metabarcoding, in particular those that amplify the whole 18S rRNA gene, such as EukA and EukB (Medlin et al. 1988). Most metabarcoding primer sets do not target specific groups. The localization of these primer sets over the 18S rRNA gene is quite diverse, but the vast majority target the V4 region (Table 2 and Fig. 1). In contrast, the number of primer sets targeting the other favoured metabarcoding region V9 is much lower. Most of the primer sets targeting a specific taxonomic group are located in the V4 region, and none are in the V9 region (Table 2). In terms of usage, the V4 region is much more popular (about 80% of published studies in marine systems, Lopes Dos Santos et al. 2022), the three most commonly used primer sets being #8 (TAReuk454FWD1 and TAReukREV3, Stoeck et al. 2010), #17 (E572F and E1009R, Comeau et al. 2011) and #16 (TAReuk454FWD1 and V4 18S Next.Rev, Piredda et al. 2017), while for the V9 region the most popular sets are #27 (1391F and EukB, Stoeck et al. 2010) and #28 (1380F and 1510R, Amaral-Zettler et al. 2009).

### Testing primer sets by in silico matching

### General primer sets

We used the PR<sup>2</sup> database (Guillou et al. 2013) which currently contains about 180,000 18S rRNA sequences with detailed taxonomic annotations to test all primer sets from the pr2-primers database. We also determined, using a set of more than 8,500 sequences representative of diverse archaeal and bacterial groups, whether these primers amplified bacteria or archaea. We only used long sequences (see Material and Methods) and allowed for a maximum of 2 mismatches on both forward and reverse primers, i.e. a maximum of 4 mismatches. For general primers, amplification success varied from 32 to more than 97% (Table S3, Fig. 2 and S1). In general, the reverse primer had a tendency to have more mismatches than the forward primer (Table S3). Primer sets targeting regions other than V4 or V9 did not perform as well in general (Fig. S1), although the best overall performance was for #76 targeting the V7 region (F-1183 and R-1443, 97.1% of sequences amplified, Lundgreen et al. 2019). If we focus on the V4 and V9 regions (Fig. 2), the best performing primer sets overall were #6 (616\*f and 1132r, 96.5%, Hugerth et al. 2014) and #29 (1389F and 1510R, 79.8%, Amaral-Zettler et al. 2009). Interestingly, the original paper describing this primer set also used another forward primer (1380F, primer set #28) on the same samples and recommended using both forward primers together, an advice which was not followed in subsequent studies (but see Lie et al. 2014). The lower percentage observed for the V9 primers should be interpreted with caution: many 18S reference sequences do not extend to the end of the V9 region and therefore will miss the signature of the reverse primer. To minimize this problem, we retained for the analysis of V9 primer sets only sequences that contain the canonical signature GGATC[AT] located at the 3' end of the V9 region. Despite performing well when allowing for 4 mismatches, some of these primer sets have at least one mismatch to PR<sup>2</sup> sequences: for example, primer set #108 (545F and 1119R, Kataoka et al. 2017) amplifies only 7.9% of the sequences with zero mismatch. Another important consideration is the size of the amplicon. Since most metabarcoding studies currently use Illumina sequencing technology, the maximum possible size to allow some overlap between the two R1 and R2 reads is about 550 bp (assuming that one uses the 2x300 bp sequencing kits), although smaller amplicons are preferable to allow more overlap. A sizeable fraction of the primer sets produce amplicons close to or larger than 600 bp (Fig. 2). The post sequencing analysis strategy in this case would be to only use one of the reads (R1 is in general less noisy) without trying to assemble R1 and R2 (Lambert et al. 2019) or to assemble the non-overlapping R1 and R2 reads with an intercalated N base (Needham and Fuhrman 2016).

Another important consideration is whether amplification is similar across the whole eukaryotic tax-

onomic range. Taking as an example the most frequently used primer set targeting V4 (#8, Fig. 3A) and looking at the amplification efficiency at the supergroup level, a significant fraction of Excavata and to a smaller extent of Rhizaria present at least 5 mismatches to this primer set (Fig. 3A top-left). Amplification is even more unlikely for sequences presenting mismatches with the forward primer because the mismatches are located at the 3' end of the primer (Fig. 3A top-right) which is the most unfavourable situation (mismatches at the 5' end are better tolerated). The average size of the amplicon also varies depending on the taxonomic group (Fig. 3B bottom). For example, Excavata have on average longer amplicons, in particular because of the presence of introns (Torres-Machorro et al. 2010). Amplicon size is then beyond the current range of Illumina sequencing. This may also induce negative bias during PCR amplification (Geisen et al. 2015). For other groups such as Opisthokonta, although the average size is compatible with Illumina sequencing, there is a large number of outlier sequences with long amplicons. This will mean that taxa corresponding to these sequences (mostly Arthropoda) will be missed from surveys conducted with this primer set, although of course this is less critical when protists are targeted. The situation with the V9 primer set #27 (Fig. 3) is somewhat similar, although there is less length variation between the different supergroups. However, for some groups, in particular Ascomycota and Bangiophyceae, there is a number of outliers that will be missed by Illumina sequencing. Again, these groups are less relevant when focusing on protists. When looking at all the general primer sets (Figure S2), some sets such as #2, 25, and 110 appear to have more taxonomic biases than others. Overall, Excavata constitute the supergroup that is most often discriminated against.

Most primer sets will not amplify archaea and bacteria, except primer sets such as #33 (515F and Univ 926R Needham and Fuhrman 2016) that were specifically designed to amplify both bacteria and eukaryotes (Figs. S3 and S4). However, some primer sets assumed to be specific to eukaryotes such as #4 (563f and 1132r, Hugerth et al. 2014) amplifies quite well archaea and bacteria. Interestingly, set # 12 (3NDf and 1132rmod, Geisen et al. 2018b) amplify only eukaryotes and archaea, but not bacteria. In most cases we tested, the reverse primer was most discriminating against archaea and bacteria.

#### Specific primer sets

In order to access a deeper diversity within a given taxonomic group primer sets have been developed with specific targets (Tables S1 and S2). Target levels are most often at the division (e.g. Haptophyta) and class levels (e.g. Chrysophyceae), although some sets are targeting supergroups (e.g. SAR

#84). Some primer sets have even more specific targets. One example is primer #65 targeting Cercozoa (S616F Cerco and S947R Cerco, Fiore-Donno et al. 2018) that contains at least 5 mismatches to all other divisions (Fig. S5) and amplifies all cercozoan groups. Primer #38 targeting Chlorophyta (ChloroF and ChloroR, Moro et al. 2009) contains at least 5 mismatches to all other divisions (Fig. S5). However, it is does not amplify all Chlorophyta as it misses picoplanktonic green algae such as Mamiellophyceae or Chloropicophyceae (Fig. S6). In contrast, several primer sets claimed to be specific of a given group are in fact quite general. For example set #87 which targets oxymonads (Oxy 18S-F and Oxy 18S-R Michaud et al. 2020) amplifies many other groups (Figs. S1 and S5). In this case, this is not critical since oxymonads only occur in termite guts and such primers will only be used in this specific context. Primer set #21 (D512for and D978rev, Zimmermann et al. 2011) which was designed to target diatoms would amplify actually most of the Ochrophyta classes but also some green algae (Fig. S6).

### R Shiny application

We have developed a website based on an R Shiny application (https://app.pr2-primers.org) that allows users to visualize and download the pr2-primers database, explore at different taxonomic levels the results of in silico amplification against the PR<sup>2</sup> and Silva databases for the primer sets from the pr2-primers database and test their own primer sets. The application is composed of 7 panels. The first panel (Fig. 4A) provides information on the database as well as a link to report issues or new primers. The second and third panels (Fig. 4B) provide an interface to the primer and primer set tables, respectively, with the options of downloading the tables and revealing/hiding specific columns. The fourth and fifth panels are used to display the results of pre-computed in silico amplification of primer sets from the database. The fourth panel (Fig. 4C) shows a synthesis of the results (similar to Fig. 2) for all primer sets. The fifth panel (Fig. 5A) is a tool to explore amplification properties of a given primer set within a taxonomic level from kingdom to class levels. The right-hand section of this panel shows general amplification characteristics, the location of the mismatches, the number of mismatches for each group and the distribution of the amplicon sizes. Finally, the sixth and seventh panels (Fig. 5B) allow users to run an *in silico* amplification with their own primers/probes (panel 6) and primer sets (panel 7) against PR<sup>2</sup> and Silva seed databases. Users can fix the maximum number of mismatches (up to 2 for each primer). For the sake of speed, only the number of mismatches is provided, not their position. Global statistics on the amplification are provided, which can be explored at different taxonomic levels. The R shiny application has been incorporated into a Docker container available at https://hub.docker.com/repository/docker/vaulot/pr2-primers.

# Conclusion

The combination of the pr2-primers database with the PR<sup>2</sup> sequence database provides a very useful resource for protist metabarcoding. It will help researchers to select the most suitable primer pairs for both broadly-targeted surveys and studies focusing on target taxonomic groups, and to test and validate in silico novel primers. We emphasize that primer pairs must also be tested on reference culture material and natural samples, as actual amplification may differ from in silico results. Hopefully this database will grow with time as novel primer pairs are developed and tested on samples from a range of environments. This will contribute to better design and comparability of microbiome analyses, inventories of protist diversity across environments, and increase our understanding of this functionally diverse and important group of organisms.

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# Data availability

No new data were created or analysed in this study. All scripts, including those for the Shiny application, are available at https://github.com/pr2database/pr2-primers (doi:10.5281/zenodo.4849528). The database is available at https://app.pr2-primers.org.

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### Author contributions statement

DV and SG conceived the study. DV, DB and FM scanned the literature for existing primers and primer sets. DV developed the database, the analysis scripts and the R shiny application. DV wrote the first draft of the paper and all co-authors edited and approved the final version.

## Additional information

Competing interests. The authors declare no competing financial interests.

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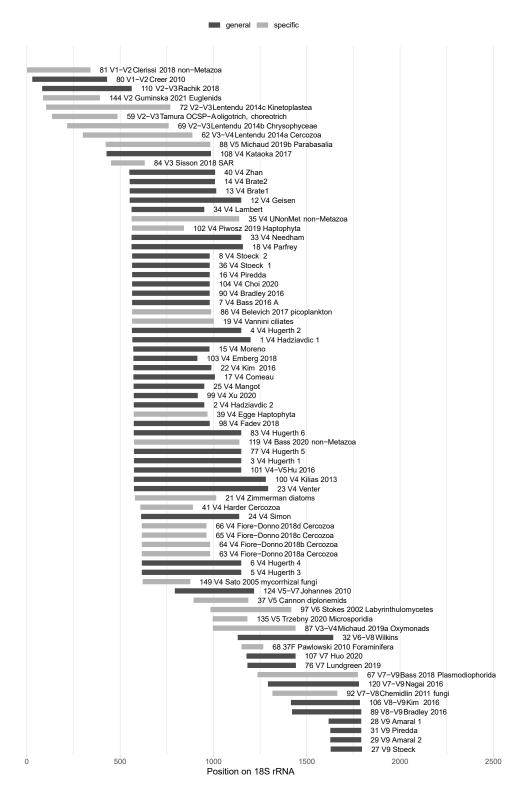
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**Table 1:** Summary of primers listed in the pr2-primers database. General primers target all eukaryotes and specific primers only certain taxonomic groups.

direction	general	specific
fwd	55	89
rev	53	88
total	108	177

Table 2: Regions of the 18S rRNA gene targeted by the primer sets from the pr2-primers database.

gene region	general	specific
37F		1
37F-41F		2
V1-V2	1	1
V1-V3		1
V2		3
V2-V3	1	3
V3		1
V3-V4		2
V4	32	15
V4-V5	1	
V5		3
V5-V7	1	
V5-V9		2
V6		1
V6-V8	1	
V7	2	
V7-V8		1
V7-V9	1	1
V8-V9	2	
V9	4	



**Figure 1:** Position of the amplified region when using different primer sets listed in the pr2-primers database along the 18S RNA gene relative to the sequence of the yeast *Saccharomyces cerevisiae* (FU970071). The labels correspond to the primer set id, the 18S region amplified, its identification name and the specific group it eventually targets. Bar shading indicates whether the primer is general (black) or specific (grey) of a taxonomic group.

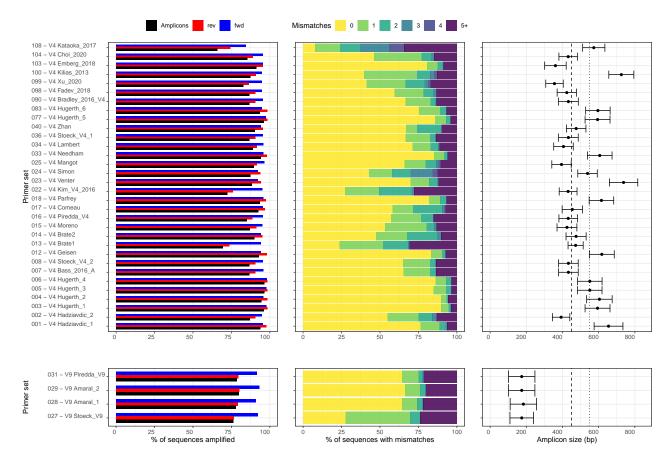


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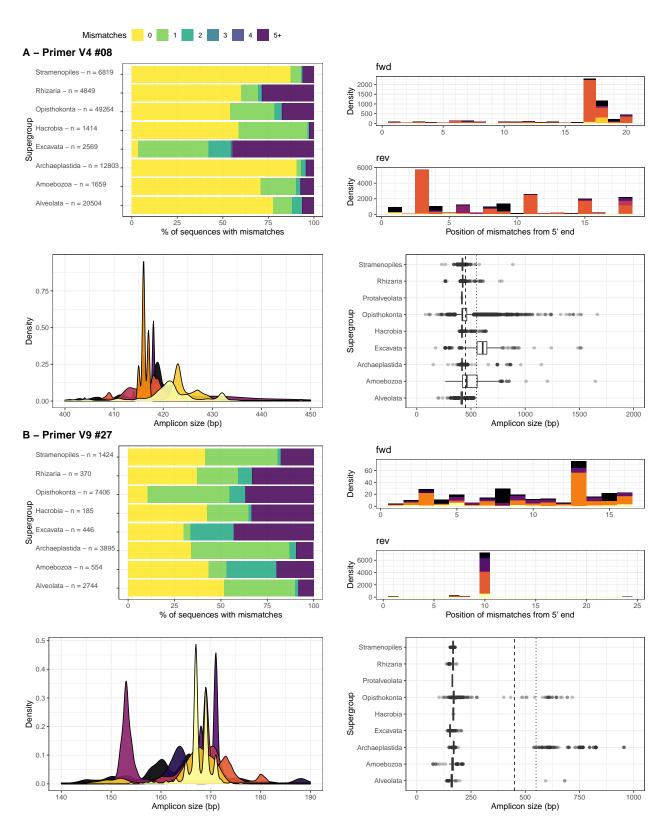
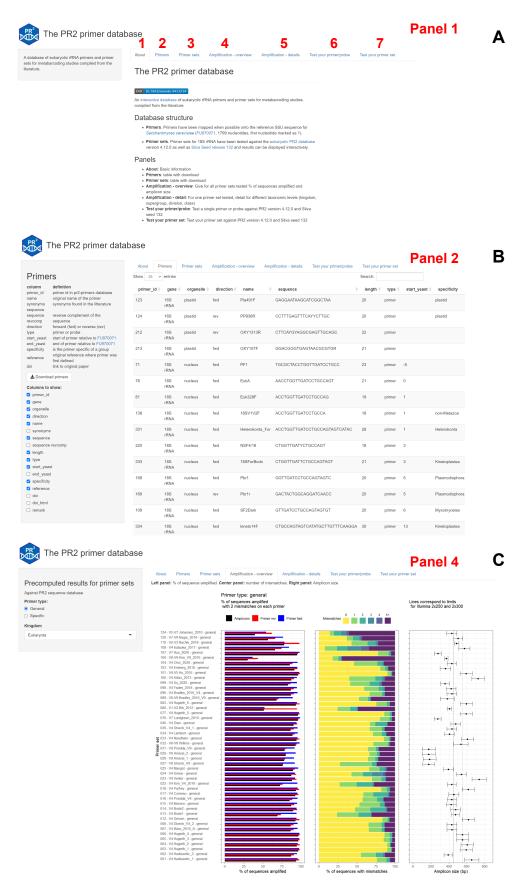
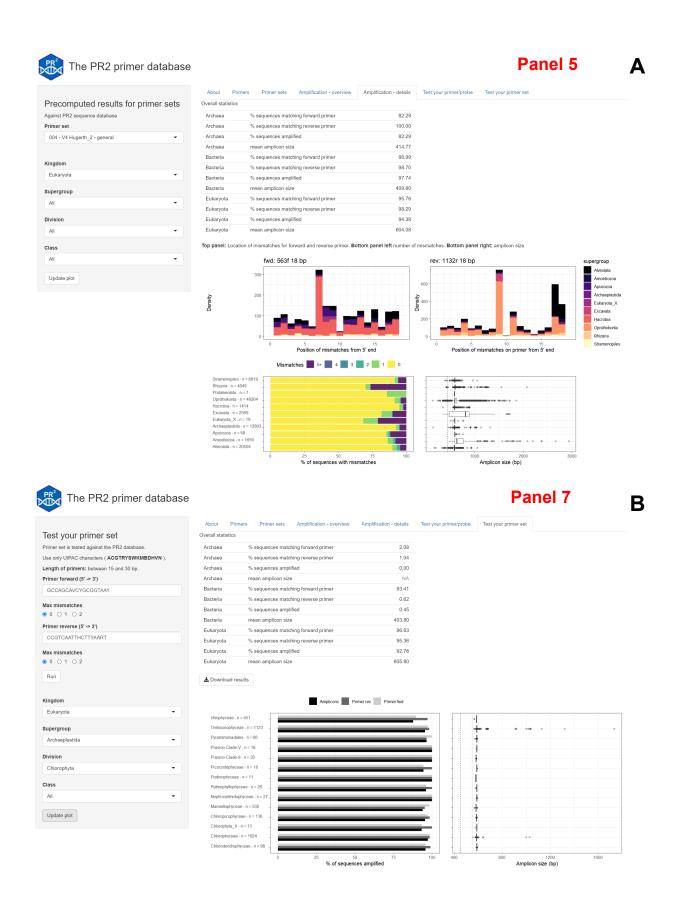


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