Orthology Guided Transcriptome Assembly of Italian Ryegrass and Meadow Fescue for Single-Nucleotide Polymorphism Discovery

Štěpán Stočes, Tom Ruttink, Jan Bartoš, Bruno Studer, Steven Yates, Zbigniew Zwierzykowski, Michael Abrouk, Isabel Roldán-Ruiz, Tomasz Książczyk, Elodie Rey, Jaroslav Doležel, and David Kopecký*

Abstract

Single-nucleotide polymorphisms (SNPs) represent natural DNA sequence variation. They can be used for various applications including the construction of high-density genetic maps, analysis of genetic variability, genome-wide association studies, and map-based cloning. Here we report on transcriptome sequencing in the two forage grasses, meadow fescue (Festuca pratensis Huds.) and Italian ryegrass (Lolium multiflorum Lam.), and identification of various classes of SNPs. Using the Orthology Guided Assembly (OGA) strategy, we assembled and annotated a total of 18,952 and 19,036 transcripts for Italian ryegrass and meadow fescue, respectively. In addition, we used transcriptome sequence data of perennial ryegrass (L. perenne L.) from a previous study to identify 16,613 transcripts shared across all three species. Large numbers of intraspecific SNPs were identified in all three species: 248,000 in meadow fescue, 715,000 in Italian ryegrass, and 529,000 in perennial ryegrass. Moreover, we identified almost 25,000 interspecific SNPs located in 5343 genes that can distinguish meadow fescue from Italian ryegrass and 15,000 SNPs located in 3976 genes that discriminate meadow fescue from both Lolium species. All identified SNPs were positioned in silico on the seven linkage groups (LGs) of L. perenne using the Geno-meZipper approach. With the identification and positioning of interspecific SNPs, our study provides a valuable resource for the grass research and breeding community and will enable detailed characterization of genomic composition and gene expression analysis in prospective Festuca × Lolium hybrids.

Core Ideas

- Transcriptomes of F. pratensis and L. multiflorum were sequenced and assembled
- We present a catalogue of SNPs for ancestry analysis and future breeding of grasses
- We defined interspecific SNPs to study parental-genome specific gene expression in hybrids
- We positioned SNPs on linkage groups for high-resolution genome constitution analysis

Grasses of the genera Festuca and Lolium belong to the Pooideae subfamily within the grass family (Poaceae) and are widely cultivated in temperate regions. They include species such as perennial ryegrass, Italian ryegrass, meadow fescue, and tall fescue (F. arundinacea Schreb.). Perennial ryegrass is a highly tillering species.

*Corresponding author (kopecky@ueb.cas.cz).

Abbreviations: AD, minimal allele count score; CDS, coding DNA sequence; DBG, De Bruijn graph; DP, total read depth; GG, genotype quality score; HQ, high quality; HRM, high-resolution melting curve analysis; LG, linkage group; OGA, Orthology Guided Assembly; PCR, polymerase chain reaction; PGAS, parental genome allele specific; QTL, quantitative trait loci; RNA-seq, RNA sequencing; SNP, single-nucleotide polymorphism.

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suitable for permanent pastures and meadows and is a dominant species for turf applications in Europe. Italian ryegrass is used for hay and silage production in temporary grasslands. Both ryegrasses are highly nutritious and high seed yielding (reviewed in Humphreys et al., 2010). However, they are sensitive to abiotic stress conditions. Meadow fescue is widely grown as a pasture crop in Northern temperate regions (Ergon et al., 2006) because of its good persistence and high tolerance to environmental stresses such as cold, freezing, and drought. Tall fescue is an important cool-season perennial forage and turf grass species with excellent drought tolerance (Rognli et al., 2010).

Intergeneric hybrids between Festuca and Lolium species, referred to as Festuloliums, combine the beneficial agronomic traits from both genera (Ghesquiere et al., 2010). During the last decades, Festuloliums have become a valuable source of new grasses for cultivation (Yamada et al., 2005). They are highly productive, nutritious, and resilient and, as such, are widely used for agricultural and amenity purposes (reviewed in Ghesquiere et al., 2010). Festuloliums exhibit significant diversity for many interesting traits, mainly as a result of their variable genome constitution, which differs markedly even among plants of the same cultivar (Kopecký et al., 2011). Identification of parental chromosomes and characterization of genomic constitution of these interspecific hybrids is typically done using cytogenetic methods such as fluorescence and genomic in situ hybridization (FISH and GISH) (Zwierzykowski et al., 1998a,b; Canter et al., 1999; Kopecký et al., 2005, 2006; Książczyk et al. 2015). However, these methods only allow the detection of large chromosomal segments and are not applicable for high-throughput screening (Kopecký et al., 2006).

In contrast to cytogenetic approaches, DNA sequence polymorphisms offer the opportunity to determine genomic constitution of Festuloliums at much higher resolution. Various DNA marker types distinguishing Lolium and Festuca genomes have been reported such as microsatellites (Pašakinskiene et al., 2000; Studer et al., 2006) and Diversity Array Technology markers (Kopecký et al., 2009). However, SNPs are the most prevalent type of polymorphisms and thus informative on account of their relatively even dispersal across the genome and their high density especially in allogamous species such as fescues and ryegrasses (Birrer et al., 2014; Wang et al., 2014; Czaban et al., 2015). Single-nucleotide polymorphisms within one species (here referred to as intraspecific SNPs) can be used for quantitative trait loci (QTL) mapping, map-based cloning, genome-wide association studies, and marker-assisted or genomic selection. Single-nucleotide polymorphisms distinguishing the progenitor species (here referred to as interspecific SNPs) can be used to study genomic constitution of interspecific hybrids such as Festuloliums or hybrid ryegrasses with a high resolution. Moreover, if identified in transcribed genome regions, interspecific SNPs can also be used to profile parental genome allele specific (PGAS) expression levels in subsequent generations of interspecific hybrids. Thus, the underlying causes of the superior phenotype could be better understood and perhaps used to improve Festuca, Lolium, and Festulolium cultivars.

RNA sequencing (RNA-seq, Mortazavi et al., 2008) is suitable to identify SNPs in the gene space of a given species, particularly in the absence of a complete genome sequence (Denoueud et al., 2008; Varshney et al., 2009; Garvin et al., 2010). While a draft set of scaffolds of the L. perenne genome has recently been published (Byrne et al., 2015), there is no high-quality genome sequence available, which could serve as a reference for read mapping and identification of polymorphisms in Italian ryegrass and meadow fescue, the two species used in this study.

Considering the available genomic resources, we set out to create a reference transcriptome for Italian ryegrass and meadow fescue based on RNA-seq on a small panel of genotypes. Illumina sequencing technology has been widely used for transcriptome sequencing since it offers high throughput and low error rate (Gonçalves da Silva et al., 2014; Peng et al., 2014; Wu et al., 2014). This technology yields short reads (up to 300 bp), which can be used to de novo reconstruct the transcriptome. Several algorithms exist for de novo assembly of short Illumina reads based on De Bruijn graphs (DBG), including Trans-ABYSS (Simpson et al., 2009; Robertson et al., 2010), Trinity (Grabherr et al., 2011), Velvet (Zerbino and Birney 2008), Oases (Schulz et al., 2012), and CLCBio Genomics Workbench (CLC Bio-Qiagen). However, a high degree of heterozygosity, typical for outcrossing species such as fescues and ryegrasses (Modrek and Lee 2002; Ruttink et al., 2013; Farrell et al., 2014), can result in transcript fragmentation and allelic redundancy in contigs that are assembled using DBG algorithms. This problem can be resolved by a second round of clustering with overlap-layout-consensus assemblers such as CAP3 (Huang and Madan, 1999). A quick and targeted strategy to perform such secondary clustering on a gene-by-gene basis for an entire transcriptome is known as Orthology Guided Assembly (OGA; Ruttink et al., 2013). The OGA strategy uses the proteome of a closely related species to guide the clustering procedure and to generate a nonredundant and annotated consensus sequence per gene (Ruttink et al., 2013).

The purpose of the experiments presented here was to identify a large and robust set of SNP markers useful to determine genomic constitution of Italian ryegrass × meadow fescue hybrids. By focusing on the transcriptome, we circumvented the lack of a reference genome sequence from the two species. The newly developed set of SNPs will also be useful to quantify PGAS expression levels in interspecific hybrids. In this paper we report on (i) the reconstruction of reference transcriptomes for meadow fescue and Italian ryegrass and their comparison with the previously published perennial ryegrass transcriptome assembled with the same OGA strategy; (ii) the identification of transcript-anchored intraspecific and interspecific SNPs in the three species; (iii) the identification of SNPs that discriminate parental genome
specific alleles in pairwise crosses between meadow fescue and Italian ryegrass; and (iv) the identification of putative genomic locations of the SNPs, based on the perennial ryegrass GenomeZipper (Pfeifer et al., 2013). This large-scale marker set we have obtained constitutes an important resource to advance genomic research in meadow fescue and Italian ryegrass, two of the most important forage grass species, and their hybrids.

Materials and Methods

Plant Material and RNA Extraction

Six genotypes of Italian ryegrass (Lm) were used for transcriptome sequencing: two genotypes of the tetraploid cultivar ’Mitos’ (Lm51 and Lm52) and one genotype of each of the diploid Italian ryegrass cultivars ‘Abercom’ (Lm53), ‘Fox’ (Lm54), ‘Prolog’ (Lm55) and ‘Sikem’ (Lm56). Six meadow fescue (Fp) genotypes were used for transcriptome sequencing: two genotypes of the tetraploid cultivar ’Westa’ (Fp52 and Fp53), one genotype of the tetraploid cultivar ’Patra’ (Fp54), and one genotype of each of the diploid cultivars ’Skawa’ (Fp51), ’Fure’ (Fp55), and ’WSC’ (Fp56). The plants were grown in a growth chamber (Weiss-Gallenkamp) at 50% relative humidity (day, 14 h of 20,000 lux light intensity at 24°C; night, 10 h at 20°C). After establishment, the plants were cut to a height of ~5 cm above ground level to stimulate tillering. After 3 wk of regrowth, 100 mg of young leaves were harvested and frozen in liquid nitrogen. Three independent samples were collected from the genotypes Lm51, Lm52, Fp52, and Fp53 and one sample from each of the remaining genotypes. Total RNA was extracted from ground samples using the RNeasy Plant Mini Kit (Qiagen, Inc.). The quality, quantity, and integrity of RNA were checked using an RNA Pico 6000 chip on a Bioanalyzer 2100 (Agilent Technologies, Inc.). Samples with RNA integrity number >7 were used for RNA sequencing.

RNA Sequencing Library Construction and Illumina Sequencing

High-throughput sequencing of Italian ryegrass and meadow fescue libraries was performed at Istituto di Genomica Applicata (IGA Technology Services, Udine, Italy). RNA sequencing libraries were generated using the TruSeq RNA Sample Prep kit v2 according to the manufacturer’s protocol (Illumina Inc.). Adapters were ligated to the complementary DNA and 200 ± 25 bp fragments were gel purified and amplified by polymerase chain reaction (PCR). DNA libraries were quantified using a Bioanalyzer 2100 (Agilent Technologies), pooled in equimolar amounts for sequencing using Illumina HiSeq2000 or HiSeq2500 instruments to produce paired-end 101 bp reads.

De Novo Transcriptome Assembly

The FASTX-Toolkit (http://hannonlab.cshl.edu/fastx_toolkit/index.html) was used to trim the 5-bp index and to discard reads with a Phred quality score <25. Reads of each sample were then used for independent de novo assembly using CLCBio Genomics Workbench v8.4. Only contigs longer than 200 bp were retained. Scaffolding was switched off to avoid long stretches of Ns in the contigs, which would interfere with the construction of a consensus sequence by CAP3 during downstream OGA assembly. The total number of reads, number of contigs, and N50 length are listed in Supplemental Table S1.

Orthology Guided Assembly

To resolve transcript fragmentation and allelic redundancy, an OGA strategy was performed combining the contigs from each of the 10 independent de novo assemblies per species. Briefly, we used 26,632 Brachypodium distachyon (L.) Beauv. proteins (The International Brachypodium Initiative, 2010) as a reference to assemble consensus transcript sequence as described previously (Ruttink et al., 2013). Transcripts matching particular B. distachyon proteins were assembled using CAP3. We then trimmed the transcripts to the coding DNA sequence (CDS), determined the remaining redundancy per B. distachyon protein, selected the longest representative sequence per B. distachyon protein (minimal CDS length of 102 bp), and thus created novel, nonredundant reference transcriptome assemblies for meadow fescue and Italian ryegrass. All transcripts were assigned to orthologous protein families of the PLAZA 3.0 Monocots database (Proost et al., 2014) as an entry point for full comparative genomics and functional annotation. The previously assembled reference transcriptome from perennial ryegrass (Ruttink et al., 2013) was included in the subsequent steps to compare the effect of using a reference transcriptome from a closely related species on read mapping and SNP calling.

For more accurate and cross-species analyses, we also identified near full-length transcripts (length of the transcript is between 85 and 115% of the respective orthologous B. distachyon CDS). An overview per orthologous B. distachyon protein is available in Supplemental Table S2. The OGA assembled transcriptome sequences are available as FASTA file and GFF with annotations in Zenodo (http://dx.doi.org/10.5281/zenodo.55304).

Read Mapping and Single-Nucleotide Polymorphism Calling

Here, we describe the analysis procedure for a single reference transcriptome. However, all analyses were performed separately on the two other reference transcriptomes in parallel. Quality trimmed RNA-seq reads of all genotypes were aligned against one of the three nonredundant reference transcriptomes using BWA (Li and Durbin, 2009). After local realignment with GATK IndelRealigner, duplicated reads were removed with MarkDuplicates. In parallel to the new reads obtained from meadow fescue and Italian ryegrass, the previously published RNA-seq reads of 14 genotypes of perennial ryegrass (Supplemental Table S1) were mapped onto the reference and all BAM files were used for combined SNP analyses.
across the three species. The SNPs were called using the UnifiedGenotypeCaller of GATK (McKenna et al., 2010; DePristo et al., 2011). The identified genotype calls per sample were further filtered using custom Python scripts. Only biallelic SNPs with genotype quality score GQ ≥ 30 and minimal allele count AD ≥ 4 were retained. We used different total read depth for tetraploid (DP ≥ 16) and for diploid (DP ≥ 10) genotypes as a trade-off between assuring a high probability of a correct genotype call and retrieving enough data for a similar number of genes given varying total library size per sample. For some perennial ryegrass samples, the library size was much lower than the average library size of the novel obtained data from meadow fescue and Italian ryegrass. Although missing data in some of the 14 perennial ryegrass genotypes may lead to some underestimation of the number of SNPs (see Fig. 4C of Ruttink et al., 2013), we required SNP call data in at least 10 out of 14 perennial ryegrass genotypes during interspecific SNP identification. With these settings, over 7000 genes exceeded the threshold number of genotypes required to call interspecific SNP in each of the species (six in Fp, six in Lm, and 10 in Lp).

For each of the tetraploid genotypes Fp52, Fp53, Lm51, and Lm52, we tested the robustness of SNP calling by comparing the genotype calls across their three biological replicates. Genotype calls present in at least two of three replicates were compared after quality filtering (GQ ≥ 30, DP ≥ 16, AD ≥ 4). If all genotype calls per SNP were consistent (two identical calls and one missing call or three identical calls), these were merged into a single genotype call per sample and used for all downstream analyses. Otherwise, the genotype call for that SNP was labeled as missing data.

Classification of Intraspecific and Interspecific Single-Nucleotide Polymorphisms

All analyses were performed in parallel on the three nonredundant reference transcriptomes of meadow fescue, Italian ryegrass, or perennial ryegrass, respectively. For each reference transcriptome, SNP calls from the different meadow fescue, Italian ryegrass, or perennial ryegrass genotypes were first classified as homozygous reference allele, heterozygous, homozygous alternative allele, or missing data. Next, for each SNP, the following criteria were used to classify it as one of following three classes: (i) intraspecific SNPs (INTRA), (ii) interspecific SNPs in two-way comparison (INTER-2W), and (iii) interspecific SNPs in three-way comparison (INTER-3W) (See Fig. 1 for the classification scheme).

(i) If two or more alleles of a given SNP were detected in any number of genotypes within a species (i.e., at least one heterozygous genotype or at least one genotype each for the homozygous reference allele and the homozygous alternative allele), the SNP position was classified as an intraspecific SNP and indexed for that species (e.g., INTRA_{Fp}).

(ii) If a SNP position was monomorphic in all genotypes of one species and carried monomorphic alternative allele in all genotypes of other species, the SNP position was called as interspecific SNP of type INTER-2W for two-way species comparison (e.g., INTER-2W_{Fp-Lm}). Such interspecific SNPs were identified for all three combinations of two-way species comparison (Fp–Lm, Fp–Lp, and Lm–Lp). In case of meadow fescue and Italian ryegrass, all six genotypes had to have a SNP call. In case of perennial ryegrass, some of the 14 genotypes had low read depth (see Supplemental Table S1) resulting in a relatively low number of SNPs with calls in all 14 genotypes. Thus, we requested at least 10 out of 14 genotypes to have SNP calls.

(iii) If all six Fp genotypes and all six Lm genotypes or at least 10 out of 14 Lp genotypes were monomorphic in one species and carried the homomorphic alternative allele in the two other species, the SNP position was called interspecific SNP of type INTER-3W for three-way species comparison (e.g., INTER-3W_{Fp,Lm,Lp} is different in Fp vs. both Lm and Lp; see Fig. 1B).

Classification of Interspecific Single-Nucleotide Polymorphisms in Pairwise Comparisons

Pairwise comparisons were made between tetraploid genotypes of meadow fescue and tetraploid genotypes of Italian ryegrass, to simulate biparental hybrid crosses. If the meadow fescue genotype contained a homozygous reference allele, and the Italian ryegrass genotype contained the homozygous alternative allele (or vice versa), the SNP was called interspecific SNP of INTER-PW type for pairwise comparison (e.g., INTER-PW_{Fp52-Lm51}). Such pairwise comparisons were made for all six combinations of three tetraploid meadow fescue genotypes (Fp52, Fp53, and Fp54) and two tetraploid Italian ryegrass genotypes (Lm51 and Lm52). For each pairwise combination, a unique HQ gene set (which is different from the near full-length gene set described above) was selected after three filtering steps (see Fig. 1C). Each OGA-assembled transcript in the separate transcriptomes is annotated to the central *B. distachyon* gene set, thus delineating orthologs across the three transcriptomes. Therefore, the effect of the reference bias can be analyzed on a gene-per-gene level. For Filter 1, we used only 8094 near full-length transcripts (85–115% of the *B. distachyon* CDS length in both species) shared between the meadow fescue and Italian ryegrass references. For Filter 2, to avoid read mapping bias, we retained only transcripts for which the ratio of average read depth for meadow fescue reference transcript and Italian ryegrass reference transcript varied between 0.5 and 2 for both meadow fescue and Italian ryegrass reads mapped on both respective transcriptomes. For Filter 3, we retained only those genes where the difference in the number of SNPs identified in meadow fescue vs. Italian ryegrass orthologous reference transcript was ≤2 or <20% of the average. Together, these three filters strongly select for transcripts with little or no reference sequence specific bias and allow studying the PGAS expression in interspecific hybrids using any of the two reference transcriptomes for read mapping. For each
Fig. 1. Classification of intraspecific and interspecific single-nucleotide polymorphisms (SNPs). Selection criteria are indicated in italics. (A) De novo assembly and Orthology Guided Assembly generate a reference transcriptome for each of the three species. Intraspecific SNPs (INTRA) are identified by mapping all RNA-seq data from *Festuca pratensis*, *Lolium multiflorum*, and *L. perenne* onto a single reference transcriptome. This analysis is performed in parallel for each reference transcriptome. (B) Interspecific SNPs are identified between two species (INTER-2W) or by comparing all three species (INTER-3W). (C) Filtering scheme for the selection of high-quality reference transcripts in pairwise genotype comparisons (INTER-PW).
pairwise comparison, a specific HQ set of transcripts was defined because these depend on the specific read depth (Filter 2) and SNP sets (Filter 3) for a given combination of parental genotypes (see Fig. 1C).

**SNPhylo**

A phylogenetic tree comparing SNP profiles of the 26 genotypes using the meadow fescue reference transcriptome was calculated in SNPhylo (v.20140430; Lee et al., 2014) using 100 bootstraps. Only SNPs without missing data in any of the 34 samples (including RNA-Seq replicates) and with minor allele frequency >10% (default settings) were used over the whole set of genotypes. The SNP sets identified with the three different reference transcriptomes gave nearly identical results (data not shown).

**Positioning of Genes using the Perennial Ryegrass GenomeZipper**

We positioned orthologous genes of meadow fescue, Italian ryegrass, and perennial ryegrass containing various classes of SNPs on seven LGs of perennial ryegrass using the GenomeZipper approach (Mayer et al., 2009). This approach is based on the collinearity of the gene order shared between a model species (e.g., *B. distachyon*) and the three species of our interest. The genetic map of perennial ryegrass (Studer et al., 2012) was used as a backbone to determine syntenic chromosome blocks between *B. distachyon* and perennial ryegrass. A similar virtual gene order was previously published for perennial ryegrass (Pfeifer et al., 2013). We placed additional genes onto the existing virtual gene order of perennial ryegrass based on orthologous relationships with *B. distachyon* genome using in-house Perl scripts. Previously unanchored meadow fescue, Italian ryegrass, and perennial ryegrass transcripts were positioned between orthologs of neighboring *B. distachyon* genes with a known position in the GenomeZipper.

We used Circos (Krzywinski et al., 2009) for circular visualization of orthologous blocks of *B. distachyon* chromosomes with perennial ryegrass LGs, distribution of all Italian ryegrass transcripts, distribution of near full-length transcripts assembled in all three species, the number of intraspecific SNPs per gene INTRA\textsubscript{Fp}, INTRA\textsubscript{Lm}, INTRA\textsubscript{Lp}, and two examples of interspecific SNPs in pairwise comparisons of potential Italian ryegrass × meadow fescue hybrids.

**Validation of Single-Nucleotide Polymorphism by High-Resolution Melting Curve Analysis**

High-resolution melting curve analysis (HRM) was employed to validate the SNPs identified in silico. Ten SNPs (from 10 genes) discriminating the alleles of meadow fescue and Italian ryegrass were selected. Primers for HRM analysis were designed to amplify 43 to 67 bp DNA fragments with a melting temperature of 60°C. High-resolution melting curve analysis–PCR was performed as described by Studer et al. (2009) in a total volume of 10 μL using 1× LightScanner High Sensitivity Genotyping MasterMix containing LCGreen PLUS (Idaho Technology, Inc.). Each reaction contained 20 ng of genomic DNA and 0.10 μL of forward and reverse primers and was covered with 15 μL mineral oil to avoid sample evaporation during PCR and the melting process. The PCR amplification was conducted in a Thermoblock 96 Cycler (SensoQuest) under the following conditions: initial denaturation for 2 min at 95°C, 40 cycles of denaturation for 30 s at 94°C, annealing for 30 s at T\textsubscript{a} (Supplementary Table S3), and elongation for 30 s at 72°C. The melting curve analysis was performed at a temperature range from 60 to 95°C in steps of 0.05°C using a LightScanner Instrument and the LightScanner and Call-IT software modules (Idaho Technology).

**Results**

**De Novo Transcriptome Assembly in Meadow Fescue and Italian Ryegrass**

Transcriptome sequencing was performed on 10 samples (corresponding to six genotypes) of meadow fescue and 10 samples (corresponding to six genotypes) of Italian ryegrass, yielding 38.6 million reads per sample on average (ranging from 14.7 to 73.5 million). After quality trimming, reads of each sample were used separately for de novo assembly using CLCBio Genomics Workbench v8.4. This yielded between 41,110 and 100,314 contigs per sample with N50 ranging from 558 to 1025 bp (Supplementary Table S1). The N50 value was markedly lower in Italian ryegrass (666 bp on average) than meadow fescue (941 bp on average) suggesting a higher level of sequence variation and heterozygosity in Italian ryegrass. Using the OGA approach, 18,952 nonredundant Italian ryegrass transcripts were assembled by combining the contigs of all six genotypes based on orthology with the *B. distachyon* proteome. Similarly, 19,036 nonredundant Italian ryegrass transcripts were assembled and annotated (Table 1).

In total, 17,455 orthologous transcripts were shared between the transcriptomes of meadow fescue and Italian ryegrass. Out of these, 16,613 transcripts overlapped with the previously published perennial ryegrass transcriptome containing 19,279 nonredundant transcripts (Ruttink et al., 2013) generated using the same OGA

<table>
<thead>
<tr>
<th>Reference transcriptome</th>
<th>INTRA\textsubscript{Fp}</th>
<th>INTRA\textsubscript{Lm}</th>
<th>INTRA\textsubscript{Lp}</th>
</tr>
</thead>
<tbody>
<tr>
<td>Fp</td>
<td>250,929 (113,924)</td>
<td>715,572 (370,524)</td>
<td>529,367 (288,958)</td>
</tr>
<tr>
<td></td>
<td>12,910 (5,552)</td>
<td>13,864 (5,966)</td>
<td>13,472 (5,940)</td>
</tr>
<tr>
<td>Lm</td>
<td>248,277 (115,390)</td>
<td>750,463 (385,592)</td>
<td>556,027 (303,890)</td>
</tr>
<tr>
<td></td>
<td>13,420 (5,750)</td>
<td>13,320 (6,279)</td>
<td>14,717 (6,258)</td>
</tr>
<tr>
<td>Lp</td>
<td>249,469 (114,545)</td>
<td>786,791 (388,114)</td>
<td>634,918 (314,057)</td>
</tr>
<tr>
<td></td>
<td>13,670 (5,768)</td>
<td>15,368 (6,288)</td>
<td>15,617 (6,321)</td>
</tr>
</tbody>
</table>
Italian and perennial ryegrass clustered relatively close from the three species formed separate clusters and both were determined using SNPhylo. Expectedly, genotypes Lm52, respectively, were identical among replicates. SNP data as 98.6, 98.9, 99.1, and 99.2% of the genotype of Italian ryegrass. The results indicated high-quality of two genotypes of meadow fescue and two genotypesing genotype calls across the three biological replicates. The robustness of SNP calling was tested by comparing orthologous transcripts that were near full-length in all three references (linked through their OGA based annotation). This is represented by a set of 6475 genes per reference transcriptome (Table 1, 2).

Single-Nucleotide Polymorphism Discovery and Robustness of Genotype Calling
The robustness of SNP calling was tested by comparing genotype calls across the three biological replicates of two genotypes of meadow fescue and two genotypes of Italian ryegrass. The results indicated high-quality SNP data as 98.6, 98.9, 99.1, and 99.2% of the genotype calls for the tetraploid genotypes Fp52, Fp53, Lm51, and Lm52, respectively, were identical among replicates.

Fig. 2. Venn diagram of the overlap in the number of transcripts in three different reference transcriptomes (Festuca pratensis, Lolium multiflorum, and L. perenne). The number of near full-length transcripts is given in parentheses.

procedure. Only 728, 542, and 858 genes were uniquely assembled in the meadow fescue, Italian ryegrass, and perennial ryegrass reference transcriptomes, respectively (Fig. 2). Most likely, this was due to low expression levels in the other species. From a total of 11,498; 10,791; and 11,183 near full-length transcripts (length of the transcript CDS varied between 85 and 115% of the respective orthologous B. distachyon CDS) in meadow fescue, Italian ryegrass, and perennial ryegrass, respectively, 8094 were shared between Italian ryegrass and meadow fescue, and 6475 transcripts were common for all three species (Fig. 2). Estimation of the number of SNPs per transcript depends on the length of the assembled transcript, which varied between species. Thus, to make accurate comparisons of SNP counts and SNP densities between species, we only compared orthologous transcripts that were near full-length in all three references (linked through their OGA based annotation). This is represented by a set of 6475 genes per reference transcriptome (Table 1, 2).

Interspecific Single-Nucleotide Polymorphisms in Group Comparisons
Interspecific SNPs (Fig. 1B) were identified by two-way comparison (when just two species have to be distinguishable) and by three-way comparison (when one species carries a different allele at a given position as compared with the other two species). This analysis was performed separately per reference transcriptome, and data was presented on either the complete reference transcriptome or on the subset of 6475 near full-length genes per reference transcriptome (Table 2) for comparisons among references.

In total, 21,992 SNPs located in 4962 genes of the Italian ryegrass reference transcriptome, which can distinguish meadow fescue from Italian ryegrass, were identified. Of these, 13,373 SNPs were located in 2668 genes of the 6475 near full-length Italian ryegrass gene set. This set of SNPs can be used to develop a platform for genotyping a broader gene pool of meadow fescue and Italian ryegrass to validate its potential to discriminate between species. Validated SNPs can further be used to characterize genome constitution of meadow fescue × Italian ryegrass hybrids without a prior knowledge of parents from which they derived. Similar number of SNPs was identified for perennial ryegrass–meadow fescue combinations (Table 2). In contrast, only 354 interspecific SNPs located in 109 genes of the Italian ryegrass reference transcriptome that consistently discriminate perennial ryegrass from Italian ryegrass were identified. Similarly, a three-way comparison identified 13,260 SNPs located in 3611 genes of the Italian ryegrass reference transcriptome, which discriminated meadow fescue from both Lolium species (Table 2). Because of the low number of interspecific SNPs distinguishing perennial ryegrass from Italian ryegrass, only 122 SNPs located in 45 genes of the Italian ryegrass reference transcriptome were
classified as species-specific for Italian ryegrass. One hundred twenty-seven SNPs located in 62 genes of the Italian ryegrass reference transcriptome were classified as species-specific for perennial ryegrass.

Because all three reference transcriptomes were annotated based on orthology with the *B. distachyon* proteome, we intersected the gene sets based on common *B. distachyon* orthologs and found that many of the genes with interspecific SNPs were commonly identified using the alternative reference transcriptomes. The numbers of SNPs identified in the set of 6475 near full-length orthologous transcripts present in all three reference transcriptomes were consistent (Table 2), indicating a limited bias of the reference transcriptomes in these analyses. A detailed comparison at the gene-by-gene level further showed high consistency in the number of SNPs called per gene across the 6475 near full-length gene sets (Supplemental Fig. S3). It is important to note that these correlations indicate reproducibility of read mapping and subsequent SNP calling and do not concern the general sequence similarity between orthologous reference sequences and also do not take into account the number of intraspecific SNPs per gene. Taken together, these analyses illustrate that, in general, the three reference sequences per gene can be used interchangeably to identify interspecific SNPs.

### Interspecific Single-Nucleotide Polymorphisms in Pairwise Comparisons

Single-nucleotide polymorphisms and corresponding genes that enabled allele discrimination in Italian ryegrass × meadow fescue hybrids derived from known tetraploid parental genotypes were identified in a set of pairwise genotype comparisons. For each pair of parents, two complete reference transcriptomes (meadow fescue and Italian ryegrass) were used. The 62,052 interspecific SNPs located in 8370 genes in the combination Fp54–Lm51 and 93,967 interspecific SNPs located in 10,918 genes in

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**Table 2. Number of interspecific single-nucleotide polymorphisms (italic) in *Festuca pratensis* (Fp), *Lolium multiflorum* (Lm), and *L. perenne* (Lp) and corresponding genes (bold) in two-way and three-way comparisons identified using three different reference transcriptomes with all genes or the 6475 near full-length gene set (in parentheses).**

<table>
<thead>
<tr>
<th>Reference transcriptome</th>
<th>Fp–Lm</th>
<th>Fp–Lp</th>
<th>Lm–Lp</th>
<th>Fp-specific</th>
<th>Lm-specific</th>
<th>Lp-specific</th>
</tr>
</thead>
<tbody>
<tr>
<td>Fp</td>
<td>20,840 (12,517)</td>
<td>20,223 (12,607)</td>
<td>358 (231)</td>
<td>11,603 (7,341)</td>
<td>134 (83)</td>
<td>130 (82)</td>
</tr>
<tr>
<td>Lm</td>
<td>21,992 (13,373)</td>
<td>22,540 (14,181)</td>
<td>354 (241)</td>
<td>13,260 (8,406)</td>
<td>122 (85)</td>
<td>127 (83)</td>
</tr>
<tr>
<td>Lp</td>
<td>24,765 (13,761)</td>
<td>26,397 (14,952)</td>
<td>472 (274)</td>
<td>15,204 (8,720)</td>
<td>179 (100)</td>
<td>178 (98)</td>
</tr>
</tbody>
</table>

---

**Fig. 3.** SNPhylo phylogenetic tree based on 33,725 single-nucleotide polymorphisms shared among 26 genotypes of *Lolium perenne*, *L. multiflorum*, and *Festuca pratensis*. Asterisk (*) indicates overlapping positions in the phylogenetic tree of the three replicates for Fp52, Fp53, Lm51, and Lm52.
Table 3. The number of interspecific single-nucleotide polymorphisms (italic) and corresponding genes (bold) in pairwise comparison of selected Festuca pratensis (FP) and Lolium multiflorum (Lm) genotypes (Fp52, Fp53, or Fp54 vs. Lm51 or Lm52) identified using two different transcriptome references with all genes or with the HQ (high-quality) gene sets per pairwise comparison (in parentheses).

<table>
<thead>
<tr>
<th>Reference transcriptome</th>
<th>Fp52</th>
<th>Fp53</th>
<th>Fp54</th>
</tr>
</thead>
<tbody>
<tr>
<td>Fp Lm51</td>
<td>88,660 (49,261)</td>
<td>83,215 (46,518)</td>
<td>60,592 (33,228)</td>
</tr>
<tr>
<td></td>
<td>10,072 (5,090)</td>
<td>9,667 (4,951)</td>
<td>7,737 (4,026)</td>
</tr>
<tr>
<td>Lm52</td>
<td>79,744 (43,818)</td>
<td>75,810 (41,814)</td>
<td>61,952 (34,096)</td>
</tr>
<tr>
<td></td>
<td>9,277 (4,688)</td>
<td>8,988 (4,587)</td>
<td>7,753 (4,021)</td>
</tr>
<tr>
<td>Lm Lm51</td>
<td>93,967 (49,920)</td>
<td>86,697 (46,638)</td>
<td>62,052 (33,050)</td>
</tr>
<tr>
<td></td>
<td>10,918 (5,090)</td>
<td>10,422 (4,951)</td>
<td>8,370 (4,026)</td>
</tr>
<tr>
<td>Lm52</td>
<td>85,456 (44,633)</td>
<td>80,180 (42,332)</td>
<td>63,687 (34,046)</td>
</tr>
<tr>
<td></td>
<td>10,168 (4,688)</td>
<td>9,775 (4,587)</td>
<td>8,374 (4,021)</td>
</tr>
</tbody>
</table>

the combination Fp52–Lm51 were identified using the Italian ryegrass reference transcriptome (Table 3). Thus, the pairwise comparison strategy enabled scoring higher numbers of interspecific SNPs and respective genes than general group comparisons (INTER-2W and INTER-3W). However, these SNPs were specific to a particular combination of parents. Slightly higher numbers of SNPs were detected when the Italian ryegrass reference was used as compared with the meadow fescue reference.

Because interspecific SNPs in pairwise comparisons discriminated between alleles derived from specific parental genomes, they can be used to quantify PGAS expression and to analyze genes preferentially expressed from one parental genome in hybrid progeny. Since our genotypes were highly polymorphic (Table 1), the possibility was raised that intraspecific SNPs interfere with read mapping to the common consensus reference obtained from different genotypes during OGA. Furthermore, read mapping bias depends on the combination of the reference and the particular hybrid genotype under study as each genotype carries different alleles leading to genotype-specific read–reference mismatch patterns. We tested this potential bias on a gene-by-gene basis (see Fig. 1C) and for each biparental combination. We found that the number of discriminatory SNPs per gene identified using a given meadow fescue reference transcript was not always equal to the number of SNPs identified using the orthologous Italian ryegrass reference transcript (Fig. 4). Therefore, after filtering, as described in Material and Methods and Fig. 1C, only sets of genes without signs of read mapping bias, the so-called HQ gene sets, were kept. This reduced the number of SNPs and corresponding genes to 52 to 56% and 46 to 52%, respectively (Table 3).

Validation of Interspecific Single-Nucleotide Polymorphisms
A set of 10 in silico identified interspecific SNPs for pairwise comparisons located in 10 nuclear genes were validated by HRM analyses. Amplification products sufficiently specific for HRM analysis were obtained for all 10 SNPs. The HRM results were in agreement with the results of the in silico SNP discovery pipeline. The only exception was SNP 1G15070_322, where a clear assignment of the melting profiles into two groups failed, possibly from the presence of an intron between the two primer pairs (Supplemental Table S3).

Genome Location of Genes Containing Various Classes of Single-Nucleotide Polymorphisms
Using the Lolium GenomeZipper, 17,768 genes were computationally ordered into the seven perennial ryegrass LGs based on the presumed synteny of perennial ryegrass with B. distachyon and using the genetic map of perennial ryegrass as a backbone (Pfeifer et al., 2013). Here, we positioned additional genes into the virtual gene order of perennial ryegrass using the GenomeZipper with B. distachyon as reference species. This expanded the GenomeZipper to 23,501 anchored genes distributed across all seven perennial ryegrass chromosomes, ranging from 2488 genes in LG6 to 4276 genes in LG2. Subsequently, we could position various classes of SNPs and their corresponding genes onto the seven perennial ryegrass LGs. This gave an overview of the global spatial distribution of various SNPs (Fig. 5). Only small differences in the frequency of intraspecific, as well as interspecific SNPs, were detected along the chromosomes. Moreover, we did not observe any SNP hotspots or large blocks of genes without intra- or interspecific SNPs. This indicates that any part of the genome can be targeted in breeding or in genomic studies and also enables the detection of even very small introgressions in Festulolium hybrids. Additional information on the position of SNPs and corresponding genes is provided in Supplemental Table S2.
De Novo Assembly of the Transcriptome of Meadow Fescue, Italian Ryegrass, and Perennial Ryegrass

Using OGA, we assembled 18,952 and 19,036 nonredundant transcripts of meadow fescue and six Italian ryegrass genotypes, respectively, which represent orthologs of ~70% of the *B. distachyon* proteome. This is highly consistent with the previously assembled perennial ryegrass transcriptome (Ruttink et al., 2013). Out of these, 11,498; 10,791; and 11,183 represent near full-length transcripts in meadow fescue, Italian ryegrass, and perennial ryegrass, respectively. The numbers are greater than the 9646 and 10,430 near full-length transcripts of perennial ryegrass (Czaban et al., 2015) but lower than 28,455 gene models identified by Byrne et al. (2015) for perennial ryegrass. This might be at least partially explained by the fact that we used only one tissue for RNA isolation, and thus we did not capture the entire transcriptome.

The main goal of this study was to develop a robust strategy to identify gene-anchored, intra- and interspecific SNPs across three closely related species. However, previous studies on genetic diversity in *Festuca* and *Lolium* revealed great variation in SNP densities across different genes within a species (Ruttink et al., 2013) as well as varying degrees of evolutionary conservation across different genes between species (Czaban et al., 2015). Clearly, SNP identification, as well as read-count-based quantification of allele-specific expression levels, critically depends on the way the reads are mapped onto a representative reference sequence. For this reason, we used multiple SNP and gene filtering to avoid read-mapping bias. The numbers of SNPs identified using different references were compared on a gene-by-gene basis. We proved that application of appropriate filtering ensures comparable results independent on the reference used.

Genetic Variability within Species Predicted by Intraspecific Single-Nucleotide Polymorphisms

A two- to three-fold difference in the number of intraspecific SNPs per gene was found between the species. Compared with both ryegrasses, meadow fescue had the lowest number of intraspecific SNPs per gene, indicating...
lower genetic variability within this species. This observation, although based on the analysis of a relatively limited number of genotypes per species, correlates with previous findings of Kopecký et al. (2009) and Kölliker et al. (1999). The low level of intraspecific genetic variability is probably a consequence of the genetic bottleneck that meadow fescue has undergone since the last glaciation (Fjellheim et al., 2006).

**Interspecific Single-Nucleotide Polymorphisms Enable the Analysis of the Genomic Composition and Gene Expression Analysis of Interspecific Hybrids**

Although not novel, SNP genotyping to discriminate plant species and distinguish interspecific hybrids and allopolyploids remains a challenging approach. Curk et al. (2015) employed 454 amplicon sequencing of 57 gene
fragments to mine 105 SNPs distinguishing parental species of modern Citrus varieties. High numbers of species-specific SNPs (~33,000) identified in the Illumina Infinium Br~assica SNP 60K array enabled discrimination of the A and C genomes in Br~assica allopolyploids (Mason et al., 2015).

The approach presented here allowed us to identify transcript-anchored SNPs that are spread evenly across the genome and can be used to distinguish between the three species (i.e., interspecific SNPs). Moreover, interspecific SNPs can be used to characterize the genomic constitution of interspecific Festulolium hybrids at a high level of resolution. Most of the recent Festulolium cultivars originated from crosses made decades ago followed by several steps of polycrosses and backcrosses (Ghesquire et al., 2010). Consequently, the information on parental genotypes is lacking for most Festulolium cultivars. For those cultivars, thousands of interspecific SNPs that are monomorphic within species and polymorphic between species (Table 2) can be instrumental to reconstruct their ancestry and relatedness. If new interspecific crosses are made with known parental genotypes, like the ones suggested here, the interspecific SNPs in pairwise comparisons (Table 3) will enable to study genome stability and fine-scale chromosomal rearrangements in subsequent generations of Festulolium (Le Scouarnec and Gribble, 2012). The great advantage of our approach is the even spread of SNP markers across the genomes and a possibility to predict the expected resolution in a given chromosomal region based on the analysis of parental transcriptomes. This may guide the choice of specific parents for interspecific crosses. Another application of selected SNPs in specific HQ gene sets (Table 3) is PGAS expression analysis. We present evidence of gene-specific read mapping bias and resolve this issue by suggesting well-defined controls to avoid reference transcriptome dependent mapping bias, which may affect read-count-based estimations of expression levels (Li and Jiang 2012).

Genotyping Platform for Large-Scale Screening

To facilitate large-scale screening of thousands to tens of thousands of plants in grass breeding programs, a high-throughput genotyping platform needs to be developed with a set of highly informative markers. Customized array-based genotyping platforms were developed for Lolium and used to construct genetic maps in biparental crosses (Studer et al. 2012), identify cultivars of Italian and perennial ryegrasses (Wang et al. 2014), and study genetic diversity and the demographic history of natural accessions of perennial ryegrass (Blackmore et al., 2015). Our SNP sets contain complete positional information (putative genome location, neighboring SNPs) on three different types of SNPs suitable for the development of novel probe sets for genes spread across the genome. Alternatively, targeted resequencing of selected regions of a genome containing intra- and interspecific SNPs could decrease the cost of genotyping. Several methods for target enrichment of genomic DNA have been developed (reviewed in Teer and Mullikin, 2010). Because of a high level of target and sample multiplexing, amplicon resequencing seems to be the most promising approach to genotype hundreds of loci in thousands of plants involved in breeding programs, as it allows simultaneous screening for known SNPs and to discover novel polymorphisms.

Apart from the results from a recent Lolium–Festuca study (Czaban et al., 2015), our data represent a valuable resource for ecological and evolutionary genomic research in these species. The two Lolium–Festuca transcriptome studies complement each other well. Czaban et al. (2015) used RNA-seq for comparative gene family analysis, phylogenetic analysis, and identification of genes under positive selection pressure. In contrast, our study provides a valuable tool for precise characterization of genomic constitution and gene expression in prospective Festulolium hybrids. Once efficient screening methods have been developed, our set of intraspecific SNPs may be used for QTL fine mapping, map-based cloning of genes involved in traits of agricultural, ecological, and evolutionary interest; genome-wide association studies; demographic history and selection analyses; ecopopulation profiling; and seed contamination screening. Thus, this study provides an outstanding resource for the grass research community and forage grass breeders. Moreover, the versatility of our approach makes it suitable for use in genomic and evolutionary studies of any interspecific hybrids and allopolyploids.

Supplemental Information Available

Supplemental information is available with the online version of this manuscript.

Acknowledgments

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