

## Comparative genomics reveals that metabolism underlies evolution of entomopathogenicity in bee-loving *Ascospaera* spp. fungi

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### ABSTRACT

*Ascospaera* (Eurotiomycetes: Onygenales) is a diverse genus of fungi that is exclusively found in association with bee nests and comprises both saprophytic and entomopathogenic species. To date, most genomic analyses have been focused on the honeybee pathogen *A. apis*, and we lack a genomic understanding of how pathogenesis evolved more broadly in the genus. To address this gap we sequenced the genomes of the leaf-cutting bee pathogen *A. aggregata* as well as three commensal species: *A. pollenicola*, *A. atra* and *A. acerosa*. *De novo* annotation and comparison of the assembled genomes was carried out, including the previously published genome of *A. apis*. To identify candidate virulence genes in the pathogenic species, we performed secondary metabolite-oriented analyses and clustering of biosynthetic gene clusters (BGCs). Additionally, we captured single copy orthologs to infer their phylogeny and created codon-aware alignments to determine orthologs under selective pressure in our pathogenic species. Our results show several shared BGCs between *A. apis*, *A. aggregata* and *A. pollenicola*, with antifungal resistance related genes present in the bee pathogens and commensals. Genes involved in metabolism and protein processing exhibit signatures of enrichment and positive selection under a fitted branch-site model. Additional known virulence genes in *A. pollenicola*, *A. acerosa* and *A. atra* are identified, supporting previous hypotheses that these commensals may be opportunistic pathogens. Finally, we discuss the importance of such genes in other fungal pathogens, suggesting a common route to evolution of pathogenicity in *Ascospaera*.

### 1. Introduction

*Ascospaera* is a diverse genus of fungi that only associates with bee nests and comprises species that can range from commensals to pathogens (Anderson et al., 1998). Its type species, *A. apis*, causes chalkbrood disease in *Apis mellifera* honey bees, while another known pathogen in the genus, *A. aggregata*, infects the alfalfa leaf-cutting bee *Megachile rotundata*. The infection starts after the ingestion of ascospores and subsequent germination in the insect midgut. The pathogen then penetrates the gut epithelium and invades the hemocoel with subsequent systemic mycosis (Aronstein and Murray, 2010). However, the mechanisms of pathogenicity are yet to be fully elucidated (Boomsma et al.,

2014). Genomic and transcriptomic studies have heavily emphasized *A. apis*, showing the role of secondary metabolites, transcription factors, mating loci and even basal metabolism genes in its virulence (Cormann et al., 2012; Getachew et al., 2020, 2018), but little-to-no genomic information exists for other *Ascospaera* species. Nonetheless, it has been proposed that some of these species originally thought to occupy a commensal niche may be considered opportunistic pathogens (Klinger et al., 2013), although the majority of *Ascospaera* species have been reported in saprophytic associations (Aronstein and Murray 2010; Pitts-Singer and Cane 2011; Bissett et al., 1996; James and Skinner, 2005).

Generally, genes emphasized in pathogenicity for *A. apis* are related to sexual reproduction (Aronstein and Colby, 2015) or penetration of the

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pathogen through the peritrophic membrane in the bees' midgut. However, once the fungus has reached the hemocoel, overcoming the host's innate immune system is also key to a successful infection (Aronstein and Holloway, 2013; Valero-Jiménez et al., 2016). These mechanisms of avoiding or suppressing immune responses are well characterized in several fungal pathogens and represent important virulence factors for entomopathogenic fungi (Avulova and Rosengaus, 2011; Xu et al., 2017; Zhong et al., 2017). Other fundamental factors for the infection rely on how the pathogen's metabolism interacts with the host to acquire nutrients and growth factors necessary for its development (DaFu et al., 2017). For instance, reactive oxygen species (ROS) defense responses and modulation of the oxidative stress in the midgut of infected bees seem to play a major role in the pathogenesis of *A. apis* to honey bees (Li et al., 2020). However, virulence factors in *A. aggregata* remain largely unclear and the role the commensal species play in bee health is opaque. Therefore, a comparative genomics approach is important to understanding the transitions and intermediate forms along the symbiotic spectrum from commensal to pathogen.

Previous phylogenies of *Ascospaera* species were built on analysis of only a few gene regions (Klinger et al., 2013). While this multi locus approach improved the understanding of *Ascospaera* evolution in comparison to prior analyses (Anderson et al., 1998) that included only ITS regions, we wanted to test for robustness of the phylogenetic relationships with genomic scale data. Therefore, in this study, we aimed to unravel the genomic diversity underlying *Ascospaera* species with different lifestyles and characterize potential genes related to the evolution of pathogenicity. This study represents the first effort to sequence the whole genomes of four *Ascospaera* species. We then annotated and compared the genomes of five species of *Ascospaera*, including two species that are known pathogens (*A. apis*, *A. aggregata*) and three that are considered saprophytic (*A. pollincola*, *A. atra*, *A. acerosa*). We expected that the evolution of pathogenicity would leave signatures of enrichment and natural selection in genes that contribute to virulence. By looking for signatures of positive selection in the genomes of pathogenic *Ascospaera* species, we are able to glimpse the results of past adaptive evolutionary events. This is because, theoretically, most mutations that change the protein coding sequence are deleterious and purged from the genome. Therefore, the protein coding genes we detect with elevated ratios of non-synonymous to synonymous mutations were perhaps retained because they provided some important function for the pathogenic species. In this sense we can explore the "genomic fossil record" of this group through DN/DS analyses. Specifically, we predicted that biosynthetic and secondary metabolite genes will be present or altered in only the pathogenic species and not the commensal species.

## 2. Materials and methods

### 2.1. Fungal strains and growth conditions

Cultures for *A. pollincola* (strain ATCC 62712) and *A. acerosa* (strain ATCC 201316) were obtained from American Type Culture Collection (ATCC; Manassas, VA). The culture for *A. atra* (ARSEF 5147) was obtained from the ARS Collection of Entomopathogenic Fungal Cultures (ARSEF; Ithaca NY). These fungi were plated on aseptic Sabouraud Dextrose Agar (SDA) and Potato Dextrose Agar (PDA), both formulations obtained from Difco (BD companies, Franklin Lakes, NJ) and the resultant growth was used for DNA extraction. *Ascospaera aggregata* (strain wild2) culture was grown from a single spore isolated from a diseased *Megachile rotundata* cadaver collected in Logan, UT by the Pollinating Insect Biology Management and Systematics Unit (USDA-ARS PIMBSR, Logan, Utah). The cadaver was confirmed as infected with a single *A. aggregata* infection through the use of the species-specific forward (5'-GCACTCCACCCCTGTCTA-3') and reverse (5'-CTCGTCGAGGGTCTTTCC-3') primers modified from James and Skinner (2005) for qPCR (Klinger et al., 2015). Spore isolation and resulting *A. aggregata* hyphal growth used for DNA extraction were

performed on V-8 media (James and Buckner 2004). All strain and growth condition information is summarized in Table 2.

### 2.2. DNA extraction and sequencing

DNA was extracted for all species using the CTAB DNA extraction procedure outlined in Carter-House et al., 2020. Libraries were prepared at the Genomics Core Facility in the Institute for Integrative Genome Biology of the University of California, Riverside, using the SeqOnce RhinoSeq protocol (SeqOnce Biosciences, Pasadena, CA). This protocol includes random enzymatic fragmentation resulting in fragments of 100–1000 base pairs. After adapter ligation and PCR amplification, these libraries were then dual size-selected for 200–600 base pair reads using AMPure XP beads. These were then sent to UC San Francisco and sequenced on the Novaseq 6000 using the NovaSeq 6000 S4 Reagent Kit v1.5 (300 cycles) with 2x150 paired-end reads.

### 2.3. Genome assembly and annotation

The heterozygosity of the genomes was inferred in GenomeScope (Vurture et al., 2017) using forward and reverse raw reads, after counting k-mers of length 21, using a hash size of 100 M and exporting its histogram in jellyfish (Marcais and Kingsford, 2011). Genome assembly was performed by the Automatic Assembly For The Fungi - AAFTF v 0.2.4 (Stajich and Palmer 2018). This tool combines Trimomatic v0.4 (Bolger et al., 2014) to clip Illumina adapters and low quality sequences (Q < 3) as well as SPAdes (Prjibelski et al., 2020) and BBTools (Bushnell B., BBMap, [sourceforge.net/projects/bbmap/](http://sourceforge.net/projects/bbmap/), May 20, 2020) for assembling the reads, NCBI-BLAST to search and trim vector and contamination, and polish contigs for accurate base pair identification with Pilon (Walker et al., 2014).

Genome annotations for *A. acerosa*, *A. aggregata*, *A. atra*, *A. pollincola* as well as for the complete *A. apis* genome (accession: GCA\_001636715.1) (Qin et al., 2006; Shang et al., 2016) were performed in the Funannotate v1.7.2 pipeline (Palmer and Stajich 2019). We used RepeatModeler v1.0.11 (Hubley et al., 2016) to build a species-specific library of repetitive elements followed by RepeatMasker v4.0.6 (Smit et al., 2015) to find and mask transposable elements, interspersed repeats and low complexity DNA sequences. The masked genome was used for *ab initio* prediction of the gene models in Augustus v3.3.3 (Stanke and Morgenstern 2005) with default parameters. It was trained based on initial *Aspergillus nidulans* seed species, along with protein evidence provided by the UniProt/SwissProt database (v2019\_11) to EVidence Modeler (Haas et al., 2008) and GeneMark-ES (Borodovsky and Lomsadze 2011) using Funannotate default evidence weights along with '–optimize\_augustus' and '–keep\_no\_stops' arguments to refine training and avoid losing valid models, with a minimum number of 150 models for the training. Evidence was also provided by BUSCO 2.0 (Simão et al., 2015), using default parameters, based on the conservation of 4,046 universal single-copy orthologs in the eukaryotes\_odb9 dataset (creation date: 02/13/2016, <https://busco.ar/chive.ezlab.org/v2/>), which was also used to assess the completeness of the genomes.

Functional annotations for the predicted proteins were obtained using Diamond (Buchfink et al., 2015) to search the UniProt/SwissProt protein database (v2019\_11) using all default parameters provided by the pipeline. Putative protein function was assigned by sequence similarity to InterProScan v5.48-83.0 (Jones et al., 2014), EggNog v1.0.3 (Huerta-Cepas et al., 2019), dbCAN and CAZyme 9.0 (Lombar et al., 2013), as well as Pfam (Mistry et al., 2021) and MEROPS v12.0 (Rawlings et al., 2013) databases. Gene ontology terms were assigned by InterPro, using default parameters. The secretome was predicted using SignalP v5.0 (Nielsen, 2017; Almagro Armenteros et al., 2019) and Phobius v1.01 (Käll et al., 2007), identifying proteins carrying a signal peptide. Assembly statistics were generated in AAFTF v0.2.4 and QUAST v4.6.3 (Gurevich et al., 2013). A gene-set enrichment analysis was

**Table 1**

Genome assembly and contig statistics.

Ascospaera Species	acerosa	aggregata	pollenicola	atra	apis
Accession Numbers	JAGYHY00000000	JAGYZ0000000000	JAGYIB000000000	JAGYIA000000000	GCA_001636715.1
Depth of Coverage	97.8X	60.1X	99X	57.9X	–
Scaffold count	5020	4503	5538	12,891	82
Total Length	18,611,625	19,806,921	19,988,041	29,072,572	20,313,079
Min length (bp)	500	500	500	996	1075
Max length (bp)	38,273	41,254	31,524	19,378	159,2427
Median contig length (bp)	2089	2780	2153	1741	129,110
Mean contig length (bp)	3707.5	4398.61	3609.25	2255.26	247720.48
L50	822	797	925	3523	13
L90	3123	2735	3265	10,268	37
N50	6542	7511	6319	2504	482,601
N90	1529	2048	1624	1228	168,129
GC content	61.64%	47.12%	50.22%	51.41%	47.66%
Heterozygosity	0.41%	0.19%	0.18%	3.17%	–
Repeat content	8.53%	5.69%	3.90%	32.20%	–
BUSCO	44.6%	59.4%	53.5%	24.4%	73.8%
Completeness Score					
Single Copy	1782 (44%)	2401 (59.3%)	2139 (52.9%)	885 (21.9%)	2981 (73.7%)
Duplicated	23 (0.6%)	5 (0.1%)	26 (0.6%)	100 (2.5%)	5 (0.1%)

**Table 2**

Fungal isolate source table. Sources, culture media and extraction methods for fungal species used in this study.

Ascospaera species	Strain <sup>a</sup>	Isolation Source <sup>b</sup>	DNA Extraction method
aggregata	USDA-ARS PIBMSR wild2	Single spore isolate from <i>Megachile rotundata</i> : Logan, UT; Cultured in lab on V-8 media	PureGene Salty
atra	ARSEF 5147	Isolated from honey in <i>Apis mellifera</i> colony: Waroona, Western Australia; Cultured in lab on SDA	PureGene Salty
pollenicola	ATCC 62712	Isolated from pollen stores of <i>Megachile rotundata</i> : Western Canada; Cultured in lab on PDA	PureGene Salty
acerosa	ATCC 201316	Isolated from <i>Megachile rotundata</i> : Lethbridge, Alberta; Cultured in lab on SDA	MoBio Ultra Clean Plant DNA Kit

<sup>a</sup> ARSEF: Agricultural Research Service Collection of Entomopathogenic Fungi, Ithaca, New York; ATCC: American Type Culture Collection, Manassas, Virginia; USDA-ARS PIBMSR: Pollinating Insect-Biology, Management, Systematics Research: Logan, Utah.

<sup>b</sup> SDA: Sabouraud Dextrose Agar; PDA: Potato Dextrose Agar; V8: Modified V8 agar (James and Buckner, 2004).

performed on the putative CAZYme and MEROPS peptidase content using the Kyoto Encyclopedia of Genes and Genomes (KEGG; Kanehisa et al., 2016) collection of the Molecular Signatures Database (MSigDB; Liberzon et al., 2011) in the software GSEA (Subramanian et al., 2005), with adjusted settings for limited number of gene sets, as follows, and otherwise default parameters: *Number of permutations = 1000*, *Collapse to gene symbols = No collapse*, *Permutation type = Gene\_set*, *Metric for ranking genes = Ratio\_of\_classes*, *Max size = 500*, *Min size = 0*.

#### 2.4. Prediction of secondary metabolites

To mine the secondary metabolite genes in *Ascospaera* spp., we employed the antibiotics and Secondary Metabolites Analyses Shell (antiSMASH) (Blin et al., 2019) pipeline v.5.1.1 for biosynthetic gene cluster (BGCs) predictions, using relaxed strictness parameters of profile hidden Markov Models (pHMM). All non-annotated genes of the new assemblies were submitted to BLASTp searches against the Non-Redundant (NR) NCBI database. The details are displayed in

supplementary table S2, along with the most significant hits and the SMCOGS references when applicable. In order to investigate the relationships between BGCs of different species, we summarized anti-SMASH results in a distance metric fashion with the Biosynthetic Genes Similarity Clustering and Prospecting Engine (BiG-SCAPE), which uses a combination of the Jaccard of domain types, Domain Sequence Similarity and Adjacency indices (Navarro-Muñoz et al., 2020). Clusters grouped together in BiG-SCAPE that displayed similar BLASTp hits were submitted to further global alignments and synteny comparisons using the Clinker pipeline and visualized in clustermap.js (Gilchrist and Chooi 2020).

#### 2.5. Detection of single copy orthologs under positive selection

We used Orthofinder (v 2.3.12) to identify single copy orthologs and infer a species tree (Emms and Kelly, 2019), using predicted amino acid sequences for the species. We specified multiple sequence alignment and BLAST as the sequence search program. The species tree was generated from concatenated alignments of the single copy orthogroups generated with STAG (Emms and Kelly, 2018). We used FastTree as the tree inference program, using a maximum likelihood model (Emms and Kelly, 2017). We performed codon aware alignments with the nucleotide and amino acid sequences corresponding to the identified single copy orthologs (SCOs) with ete3 (v 2.0.3) mixed mode alignment (Huerta-Cepas et al., 2010). We used the “ete3 build” command to convert amino acids to nucleotides if the average protein similarity was higher than 90%.

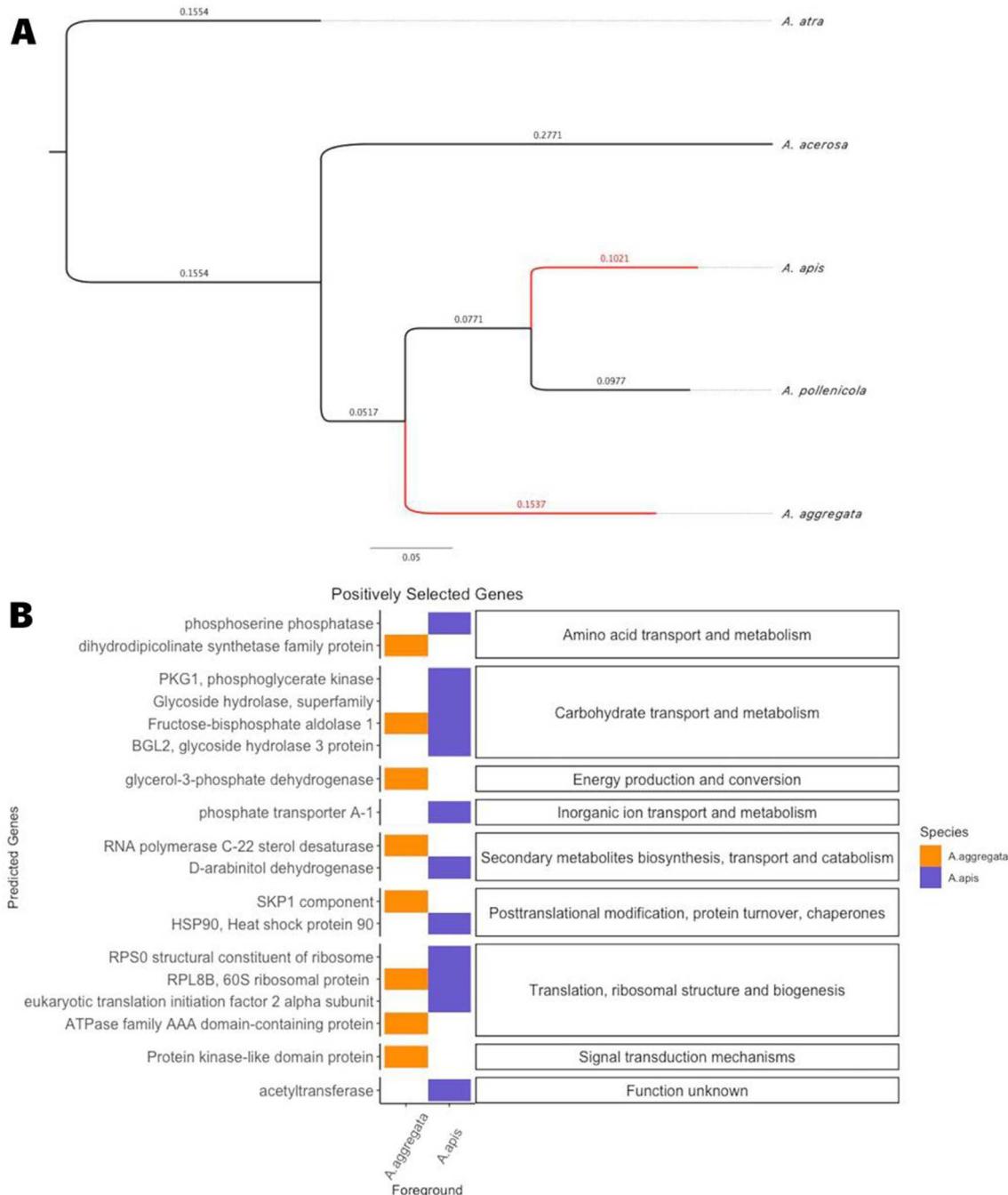
To detect signatures of positive selection, we used the “ete3 (v 2.0.3) evol” function to run a branch-site model on nucleotide alignments of the SCOs (Huerta-Cepas et al., 2010). We marked the tree by setting each pathogen alone as the foreground against the other four species as the background to determine genes specific to each pathogen under positive selection. We repeated these steps after excluding *A. atra* (a commensal) due to the relative incompleteness of its genome compared to others. This allowed us to pull even more high-quality single copy orthologs under significant positive selection between the two pathogens. The results from the five species versus four species (no *A. atra*) comparison are delineated in Supplemental Table 1.

#### 2.6. Quality control

After only pulling out single copy orthologs that showed signatures of significant positive selection ( $p < 0.05$ ) for each model, we then went through each alignment by hand to rule out false positives due to missing pieces or misalignments. To account for multiple tests we used

the qvalue package (version 2.22.0) in R (version 4.0.3) to convert p-values from the CodeML output to q-values (Dabney et al., 2010). We removed any genes with false discovery rates (FDR) greater than 5% (or q-value > 0.05). To remove cryptic paralogs, we used Notung which is a gene-tree species tree reconciliation software (Chen et al., 2000). We generated pairwise predictions for orthology versus paralogy in each gene across all 5 species. Genes were only kept if no paralogs were present in the resulting gene homology table. We then designated any

alignments with average Ks values above three as saturated and removed them (De La Torre et al., 2017). For the branch-site model, saturation does not increase the rate of false positives, rather a high dS is more of a concern for a loss of power (false negatives) (Gharib and Robinson-Rechavi, 2013). With that in mind, we provide conservative estimates of genes under positive selection.



**Fig. 1.** Natural selection on carbohydrate metabolism and transport may be the most important process underlying evolution of pathogenicity in the genus *Ascospheara*. A) Species tree generated in Orthofinder (v 2.3.12) by pulling single copy orthologs (Emms and Kelly, 2019; Emms and Kelly, 2017; Emms and Kelly, 2018) and visualized with FigTreev1.4.4. Red lines indicate the known pathogen lineages. Bootstrap supports 100% for all nodes, branch lengths represent nucleotide evolution. B) Out of 1,602 single copy orthologs for the 5 species analysis and 3,058 when excluding *A. atra*, 128 showed signatures of significant positive selection (FDRP < 0.055%). The x-axis represents which species were marked as the foreground for CodeML analysis before running branch-site models. The group "5 species" represents the analysis including *A. apis*, *A. pollenicola*, *A. aggregata*, *A. atra*, and *A. acerosa*. The "4 species" is the same but excludes *A. atra*. The facet on the right side represents the GO terms for the predicted genes on the left. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

### 3. Results

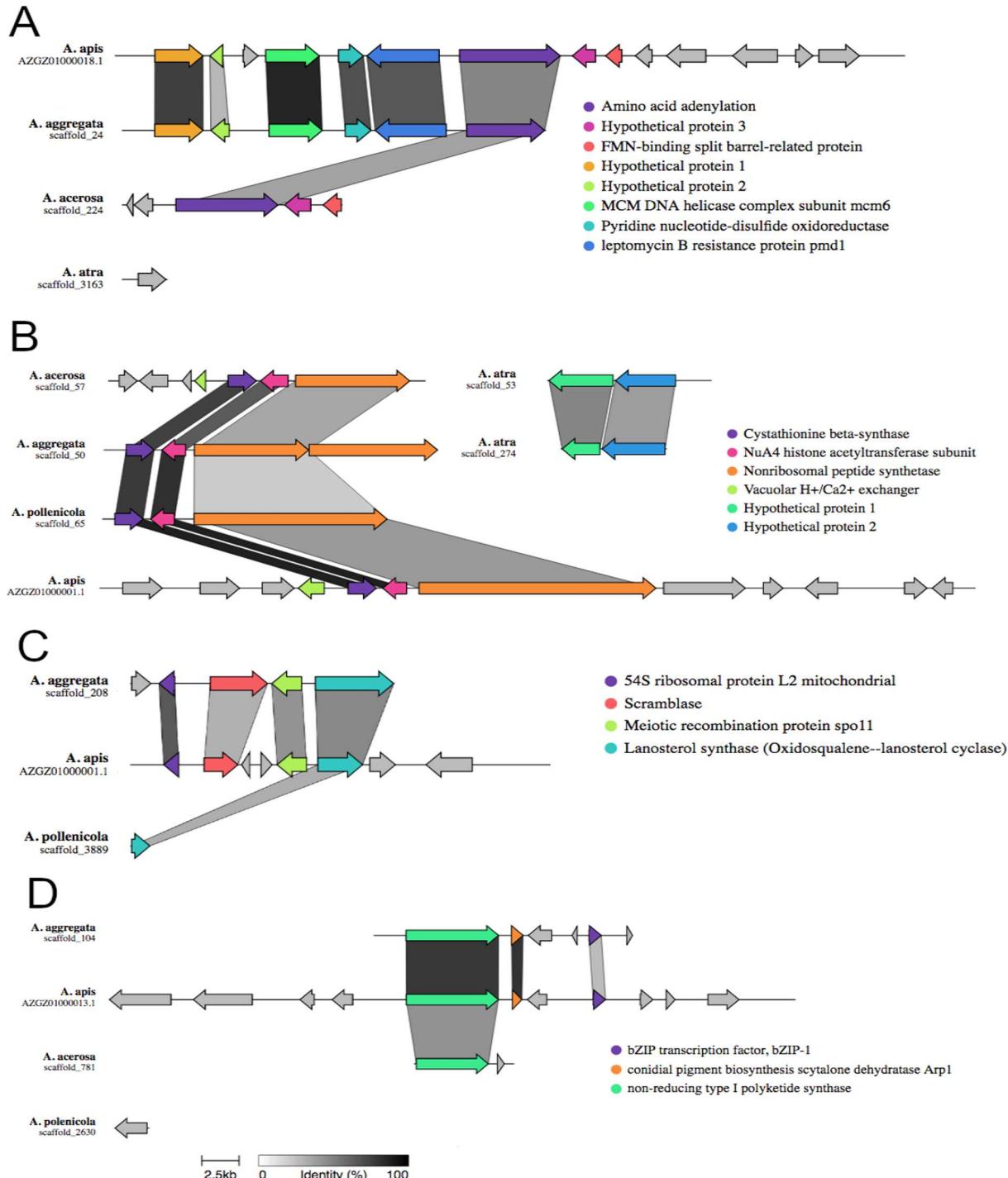
#### 3.1. Genome assembly

Genome quality statistics and BUSCOs completeness scores are summarized in depth in Table 1. In brief, our genome completeness ranged from 24.4%–73.8%, N50 from 2,504–482,601, and L50 from 13–3,523 (Table 1). The coverage ranged from 57.9–99x, the GC content from 47.12–61.64, the heterozygosity from 0.18–3.17 and the repeat content from 3.90–32.20 (Table 1).

A gene set enrichment analysis of MEROPS and CAZYme families did not reveal any significant hits.

#### 3.2. Phylogeny and single copy orthologs under positive selection for pathogens

To further characterize genes within these families and how they are tied to the evolutionary history of the genus *Ascospaera*, we assessed the selective pressure in different branches of their phylogeny. Across all five species, we detected 1,602 single copy orthologs. When we excluded



**Fig. 2.** Alignment and synteny of homologous Biosynthetic Gene Clusters (BGCs) in *Ascospaera* spp. The shading of the bars connecting aligned regions represents the percent identity between shared genes as indicated in the scale bar. A) Non-ribosomal peptide synthase cluster 1, B) Non-ribosomal peptide synthase cluster 2, C) Terpene cluster, D) Type 1 polyketide synthase cluster.

*A. atra* we detected 3,058 single copy orthologs. Our resulting species tree revealed that *A. apis* and *A. pollenicola* were most closely related to each other, forming a pair of sister taxa (Fig. 1A). *Ascospaera aggregata* was sister to the *A. apis* and *A. pollenicola* pair, followed by *A. acerosa* and most distantly *A. atra* (Fig. 1A). After intensive quality control measures about 20% (n = 279 for all 5 species, n = 616 when *A. atra* excluded) of the single copy orthologs analyzed were converted to nucleotide alignments and used in CodeML analyses to detect signatures of positive selection in the pathogens. After manually inspecting each result from CodeML and removing cryptic paralogs to eliminate false positives, we had a total of 18 genes with significantly elevated DN/DS ratios in the pathogens (FDR < 5%, Fig. 1B, supplementary table S1). The two most abundant classes of genes were related to primary metabolism and protein processing based on gene ontology (GO) terms. Broadly, 7 of these genes relate to amino acid, carbohydrate and inorganic ion transport and metabolism, 6 are involved in RNA processing, translation and post translational modification, 2 in secondary metabolite biosynthesis, transport and catabolism and 2 in energy production and signaling (Fig. 1B, supplementary table S1).

### 3.3. Shared and unique biosynthetic gene clusters between species

In order to investigate what positively selected genes may be involved in biosynthetic pathways, we screened for BGCs that would provide clues to the virulence of the pathogenic *Ascospaera* species. For this, we predicted and compared secondary metabolite genes in the newly assembled genomes to our new annotation of the *A. apis* genome (Fig. 2). *Ascospaera aggregata* displayed the most BGCs in common with the honeybee pathogen (*A. apis*). Similarities included the terpene oxidosqualene lanosterol cyclase (87.64% identity with *A. apis* from BLASTp). In *A. apis*, this cluster included the translation initiation factor 4B, SGT1 and CS domain protein, and 54S ribosomal protein L2 mitochondrial genes. *Ascospaera aggregata* displayed genes for DNA damage repair protein Rad9 and 60S ribosomal protein L2 with 66.77% and 71.76% identity to *A. apis*, respectively (supplementary table S2). The meiotic recombination protein spo11 is also present in the cluster of both species (Fig. 2C). Another cluster shared by the two pathogen species was a non-reducing type 1 polyketide synthase (T1PKS), classified by SMCOG as a beta-ketoacyl synthase (Score: 206.9; E-value: 8.9e-63 in *A. apis*, Fig. 2D). The cluster has genes encoding for conidial pigment biosynthesis scytalone dehydratase Arp1, Zn(2)-C6 fungal-type DNA-binding domain protein and bZIP-1 transcription factor in both pathogens. Unlike the pathogen species, *A. pollenicola* exhibited 100% similarity in the T1PKS cluster with the 1,3,6,8-tetrahydroxynaphthalene biosynthetic gene cluster from *Nodulisporium* sp. ATCC74245 (supplementary table S2). A nonribosomal polyketide synthase cluster containing genes encoding nucleotide oxidoreductases and leptomycin resistance proteins were also shared among the two pathogens (Fig. 2A). This cluster's primary biosynthetic enzyme, which encodes an amino acid adenylation domain, is similar to a copy found in *A. acerosa*, with approximately 50% of identity (Fig. 2A). *Ascospaera apis* was the only species to contain a fungal ribosomally synthesized and post-translationally modified peptides (F-RiPP) cluster (supplementary table S2).

No clusters shared by or exclusive to the commensal species were found, although *A. acerosa* displayed one exclusive cluster containing a AMP-dependent synthetase and ligase, with 55.75% identity to Hydroxamate-type ferrichrome siderophore peptide synthetase from *Penicillium digitatum* Pd1 (supplementary table S2). Additionally, all of the species presented one Nonribosomal peptides (NRPS) cluster with an AMP-dependent synthetase and ligase gene (Fig. 2B) that varied between 40% and 60% identity with D-alanine-poly(phosphoribitol) ligase subunit 1 from *Paracoccidioides lutzii* Pb01. The exception was *A. acerosa*, to which the BLASTp search returned N-(5-amino-5-carboxyptenanyl)-L-cysteinyl-D-valine synthase from *Coccidioides immitis* with 81% identity. *Ascospaera aggregata* harbored, in this cluster,

another AMP-dependent synthetase and ligase gene that returned 44% identity with enterobactin synthetase component F from *Coccidioides immitis* RMSCC 2394, but did not align with the other genes (supplementary table S2). Another gene found in this cluster for all species was a cysteine synthase that showed 83.68% identity with a cystathionine beta-synthase gene from *A. apis*. Finally, and also present in all species, an NRPS-like cluster containing AMP-dependent synthetase and ligase as its main gene, returned matches from BLASTp ranging from 58% to 100% identity with Male sterility, NAD-binding protein from *A. apis*. A second copy of this NRPS-like cluster existed in all species, with the same BLASTp hit in *A. apis* and *A. pollenicola* for the primary biosynthetic gene, but with different secondary genes (supplementary table S2).

## 4. Discussion

Natural selection on carbohydrate metabolism and protein processing genes may be the most important process underlying evolution of pathogenicity in the genus *Ascospaera*. In this paper, we describe the genomes of four *Ascospaera* species and provide, for the first time, a thorough gene content analysis and comparative genomics of these species along with the previously published *A. apis* genome. Assessment of the quality of the genome assemblies indicate they were not as complete as preferred for comparative genomics. This could be due to the repeat content because our GC content, heterozygosity and DNA extractions do not appear problematic (Table 1, supplementary figure S1). Alternatively, these low BUSCO scores could be related to an overabundance of introns (Jauhal and Newcomb, 2021). Nevertheless, this makes our results more conservative because they represent only a subset of the possible genes. Although BUSCO scores indicate that some genes may be absent due to the incomplete nature of the genomes, our analysis identifies important metabolic and virulence genes for the new genomes of *A. aggregata*, *A. acerosa*, *A. pollenicola* and *A. atra*.

Glycoside Hydrolases may represent a novel potential for characterization of commensalism in these fungi. The GH2 family includes  $\beta$ -galactosidases,  $\beta$ -glucuronidases,  $\beta$ -mannosidases, which are mainly involved in the hydrolysis of sucrose, maltose and trehalose and have been associated with saprophytic niches of pollen colonization (Gilliam et al., 1989). Such enzymes were also reported in *Ascospaera*, being proposed as potential markers for the identification of *A. apis* causing the chalkbrood disease in bee colonies (Gilliam and Lorenz, 1993). This, coupled with the fact that Glycoside Hydrolases are observed in this study being under positive selection in *A. apis*, suggests that this gene likely derived from those homologs present in commensal species and that its functions are advantageous to the pathogenic niche, thereby being fixated in its populations. Whether this is due to paralogy and exactly what functions are involved in these different niches, however, still needs to be elucidated by further studies.

Primary metabolic flexibility has also been shown to play a key role in virulence for several pathogenic fungi (Ene et al., 2014). Many of the orthologous genes that have signatures of positive selection in our study perform primary metabolic functions with an emphasis on carbohydrate transport and metabolism. This is consistent with other studies where the highest percentage of enriched pathways in *A. apis* during infection had to do with metabolism related genes (Getachew et al., 2020). Similarly, metabolic flexibility has been demonstrated in the human pathogenic yeast *Candida albicans* in its ability to express glycolytic, gluconeogenic and glyoxylate cycle enzymes simultaneously allowing for assimilation of several carbon sources at once (Sandai et al., 2012). Furthermore, virulence was reduced when any of the three mentioned cycles were disrupted in *C. albicans* as well as in *Cryptococcus neoformans* mutants with glycolytic defects (Barell et al., 2006; Price et al., 2011). In fact, in *C. neoformans* the intimate role of metabolism regulation in virulence is well documented (Kronstad et al., 2012). Still, researchers were surprised to find that *A. apis* could grow well on several different tested substrates besides cellulose indicating that metabolic flexibility may be key to its success as well (Shang et al., 2016). These

findings are consistent with our results showing that the abundance of genes coding for carbohydrate active enzymes seem to be driving the evolution pathogenicity in *A. apis* and *A. aggregata*. One of the specific enzymes under positive selection in both pathogens was fructose-bisphosphate aldolase 1 (FBA1), which has been shown to be better at hexose synthesis through the gluconeogenic pathway (Marsh and Lebherz, 1992). Hence, it might prove important for the *Ascospaera* pathogens to utilize different sugar metabolic pathways. This specific enzyme, FBA1, is a key virulence factor in *Mycobacterium tuberculosis*, *Toxoplasma gondii*, and *Francisella novicida* (Puckett et al., 2014; Blume et al., 2015; Ziveri et al., 2017). It is, therefore, tempting to speculate that such enzymes may play a similar role in utilizing alternative carbon sources in entomopathogenic *Ascospaera* species. Another carbohydrate metabolism enzyme showing signatures of positive selection in our *Ascospaera* pathogens was D-arabitol dehydrogenase. It was first described in the context of pathogenicity in plants (Hallborn et al., 1995), then subsequently found in the plant pathogen *Uromyces fabae* with high titers of D-arabitol dehydrogenase in the haustorium of the fungus, one of its pathogenic structures, used to penetrate the cell wall and infect the plant (Link et al., 2005). Additionally, this enzyme has a detoxifying activity for reactive oxygen species (ROS) produced by the host as a defense mechanism against the fungus (Link et al., 2005). Furthermore, D-arabitol dehydrogenase was found to be the most highly down-regulated gene in a transcriptomic analysis of *A. apis* in vivo-versus in vitro (Cormann et al., 2012). These two lines of evidence - transcription and positive selection - strongly suggest that D-arabitol dehydrogenase is an important gene for *Ascospaera* pathogenicity. This has interesting implications for the role this enzyme might play not only for the metabolism, but also for the pathogenicity of entomopathogenic fungi in general, especially considering studies that have demonstrated that filamentous endophytic insect pathogenic fungi such as *Metarhizium* spp. and *Beauveria* spp., use very similar mechanisms to infect their hosts. In fact, the same gene appears to be involved in the processes of virulence in insects and in plant colonization (Branine et al., 2019).

Secondary metabolite genes also seem to be involved in pathogenicity and are in general observed more in the clade comprising both bee pathogens and *A. pollericola*. For example, *A. apis* presented an exclusive fungal ribosomally synthesized and post-translationally modified peptides (F-RiPP) biosynthetic cluster, comprising the cytochrome P450 gene. Molecular characterization of this enzyme family in the entomopathogenic fungus *B. bassiana* revealed that cytochrome P450 is involved in the degradation of hydrocarbons in the outermost layer of insects' epicuticle (Pedrini et al., 2010). As previously mentioned, most filamentous entomopathogenic fungi penetrate the exoskeleton to infect insect hosts. However, *Ascospaera* spp. spores infect bee larvae after being ingested, and thus need to overcome the peritrophic membrane (PM) barrier to cause disease. Although hydrocarbons haven't yet been described in the PM, its composition is mostly of chitin, glycosaminoglycans, as well as proteins and proteoglycans (Hegedus et al., 2009). N-acetyltransferase O1 and gamma-glutamyl transpeptidase, present in the F-RiPP biosynthetic cluster may be involved in the adhesion and degradation of the PM by this pathogen. A class of acetyltransferase also showed signatures of significant positive selection in *A. apis*, once again highlighting the potential arsenal of carbohydrate active enzymes on the capacity of the genus to infect its hosts. Similar mechanisms of chitin degradation enabling active PM invasion have been reported for other bee pathogens, such as that of the bacteria *Paenibacillus larvae* (Garcia-Gonzalez and Genersch, 2013).

The presence of this gene cluster is especially interesting to consider in light of our other positively selected genes in the pathogen clade being implicated in post translational modifications, as they could be potentially playing ubiquitin-like roles (Getachew et al., 2020). Post translational modification might be especially useful inside a host or between different lifestyles as in opportunistic pathogens (Lorenz 2013). In *C. neoformans*, upon temperature shifts associated with entry into a host, the mRNA encoding ribosomal proteins are rapidly degraded (Bloom

et al., 2019). This transcriptional and translational rewiring has been suggested to be a key mechanism for *Cryptococci* to withstand stress and evade the innate immune system (Bloom et al., 2019). Similarly, our positively selected gene dihydridipicolinate synthase, present in a T1PKS biosynthetic cluster in *A. apis* and *A. aggregata*, was shown to be important in stress tolerance, vegetative growth and pathogenesis in *Fusarium asiaticum* (Ren et al., 2018).

Infections caused by *A. apis* and *A. aggregata* are known to be temperature sensitive (Bailey, 1968, Xu and James, 2012). In the alfalfa leafcutting bee (*Megachile rotundata*), both high and low temperatures appear to induce an immune response before infection can take hold (Xu and James, 2012). Temperature stress on *Ascospaera* is especially interesting because heat shock proteins present in biosynthetic clusters for *A. apis* and *A. pollericola* show signatures of positive selection in *A. apis*. Such proteins have been implicated in virulence in several other pathogenic fungi. For instance in *Metarhizium robertsii* (a widely distributed insect pathogen used for insect pest control) when genes responsible for heat tolerance were knocked out, the expression of five different heat shock proteins were eliminated and virulence was highly reduced in the *Galleria mellonella* host (Xie et al., 2019). Similarly, *Aspergillus fumigatus* demonstrated an inability to grow in vitro and a loss of virulence in a murine model when HSP90 was repressed (Lamoth et al., 2014), demonstrating the importance of chaperone-like functions in the virulence of other Eurotiales and possibly in the genus *Ascospaera*.

In regard to the ribosomal proteins under positive selection, there are several "extra ribosomal" functions notably implicated in immune signaling and disease (Zhou et al., 2015). For instance, some of these ribosomal proteins are found in the terpene lanosterol synthase (oxidosqualene cyclase) cluster, showing their involvement in the biosynthesis of terpenes. This BGC is present only in the bee pathogens *A. apis* and *A. aggregata* and in *A. pollericola*. Lanosterol synthase catalyzes the conversion of (3S)-2,3-oxidosqualene to lanosterol in the biosynthetic pathway of sterols and triterpenes (Abe, 2007; Shang et al., 2010). The lanosterol backbone can be, then, modified to a variety of different structures. A similar lanosterol cyclase cluster has been proven to be upregulated in *Metarhizium anisopliae* during the early stages of infection in the tick *Rhipicephalus microplus*, which indicates an involvement with the pathogenic process in this fungus (Sbaraini et al., 2016) and quite possibly in the pathogenesis to both honeybees and leaf-cutting bees as well.

We demonstrate that several genes playing classic entomopathogenic roles in ascomycete fungi are also present in *Ascospaera* species previously thought to be commensal. For example, *A. acerosa* presented an exclusive BGC containing only a hydroxamate-type ferrichrome siderophore peptide synthetase gene, which is a common type of siderophore produced by hypocrelean fungi (Liu et al., 2017) suggesting a possible virulent activity for the species. Additionally, a biosynthetic cluster similar to D-alanine-poly (phosphoribitol) ligase was found in all species, except in *A. acerosa*. This cluster displayed high similarity to N-(5-amino-5-carboxypentanoyl)-L-cysteinyl-D-valine synthase. To date, there is no comprehensive characterization of this ligase in fungi, but there is very robust evidence that it is necessary for the avoidance of insect cationic antimicrobial peptides by the modification of teichoic acids in the cell wall. In the entomopathogenic bacteria *Bacillus thuringiensis* and *B. cereus* (Wu et al., 2019), the mechanism involves positively charging the cell surface thus repelling these AMPs and resisting the host's immune response. *Ascospaera aggregata* displayed a second gene in this biosynthetic cluster with high amino acid identity to the enterobactin synthetase component F, a homolog of the catecholate-like siderophore produced by Enterobacteriaceae and other Eurotiomycetes (Haas et al., 2003). Furthermore, an NRPS cluster in *A. apis*, *A. aggregata* and *A. acerosa* contained a pmd1 gene, responsible for resistance to the potent antifungal Leptomycin B. This is, to our knowledge, the first report of antifungal resistance genes in *Ascospaera* spp. The biosynthetic cluster has highly similar genes to the siderophore

dimethylcoprogen produced by the citrus pathogen *Alternaria alternata* (Chen et al., 2013), which has also been previously identified in entomopathogenic fungi (Krasnoff et al., 2020; Molnár et al., 2010). Taken together, our findings agree with the previous hypothesis that additional *Ascospaera* species besides *A. apis* and *A. aggregata*, have the potential to be opportunistic pathogens of bees (Bissett et al., 1996; Klinger et al., 2013; Skou and Hackett, 1979), implicating that entomopathogenicity is a characteristic that most likely evolved from a saprophyte or commensal niche.

## 5. Concluding remarks

Overall, our study provides a genomic and evolutionary landscape for the under-studied virulence factors of bee infections in the fungal genus *Ascospaera*. Genes encoding ribosomal proteins may be important in these interactions by affecting protein synthesis. Additionally, secondary metabolism genes involved in fungicide resistance, iron scavenging and polyketide synthases seem promising as candidate virulence factors. More experimental work is needed to understand the function of such factors and how/if they relate directly to virulence in the bee hosts by entomopathogenic and opportunistic *Ascospaera*. Co-genomic approaches that take into account the host genome are needed to understand whether the genes under positive selection in our study are a consequence of coevolution or other environmental pressures. Additional work should be directed toward understanding where each species falls on the symbiotic spectrum, because we demonstrate that species thought to be 'commensal' may be beneficial or opportunistic pathogens. This information is necessary before we can further understand the evolution of pathogenicity in the group. Lastly, once these potential pathogenicity genes are validated experimentally, they can be used in an applied setting to target the pathogenic species more specifically without harming other potentially beneficial fungi found in pollen provisions.

## Declaration of Competing Interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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## Data Availability Statement

These Whole Genome Shotgun project assemblies and annotation have been deposited at DDBJ/ENA/GenBank under the accessions JAGYHY0000000000, JAGYHZ0000000000, JAGYIA0000000000 and JAGYIB0000000000. The versions described in this paper are versions JAGYHY0100000000, JAGYHZ0100000000, JAGYIA0100000000 and

JAGYIB0100000000. The Illumina sequence data are associated with the BioProjects PRJNA725040, PRJNA725042, PRJNA725043 and PRJNA725050.

## Appendix A. Supplementary data

Supplementary data to this article can be found online at <https://doi.org/10.1016/j.jip.2022.107804>.

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