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## **ORIGINAL ARTICLE**

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# New insights into global biogeography, population structure and natural selection from the genome of the epipelagic copepod Oithona

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## Abstract

In the epipelagic ocean, the genus Oithona is considered as one of the most abundant and widespread copepods and plays an important role in the trophic food web. Despite its ecological importance, little is known about Oithona and cyclopoid copepods genomics. Therefore, we sequenced, assembled and annotated the genome of Oithona nana. The comparative genomic analysis integrating available copepod genomes highlighted the expansions of genes related to stress response, cell differentiation and development, including genes coding Lin12-Notch-repeat (LNR) domain proteins. The Oithona biogeography based on 28S sequences and metagenomic reads from the Tara Oceans expedition showed the presence of O. nana mostly in the Mediterranean Sea (MS) and confirmed the amphitropical distribution of Oithona similis. The population genomics analyses of O. nana in the Northern MS, integrating the Tara Oceans metagenomic data and the O. nana genome, led to the identification of genetic structure between populations from the MS basins. Furthermore, 20 loci were found to be under positive selection including four missense and eight synonymous variants, harbouring soft or hard selective sweep patterns. One of the missense variants was localized in the LNR domain of the coding region of a malespecific gene. The variation in the B-allele frequency with respect to the MS circulation pattern showed the presence of genomic clines between O. nana and another undefined Oithona species possibly imported through Atlantic waters. This study provides new approaches and results in zooplankton population genomics through the integration of metagenomic and oceanographic data.

KEYWORDS

genome, Mediterranean Sea, phylogeography, selection

# 1 | INTRODUCTION

Oceanic global changes are thought to have a great impact on zooplankton communities, notably through long timescale observations that have shown significant changes in copepod populations (Beaugrand, Reid, Ibanez, Lindley, & Edwards, 2002). The study of pelagic copepod populations at the molecular level helps to identify environmental factors that drive the appearance and fixation of adaptive traits. Current approaches applied to pelagic copepods typically use ribosomal genes, mitochondrial cytochrome oxidase subunit I and II genes and microsatellites markers to identify species, genotypes and haplotypes (e.g., Blanco-Bercial, Álvarez-Marqués, & Bucklin, 2011; Blanco-Bercial, Cornils, Copley, & Bucklin, 2014; Cornils, Wend-Heckmann, & Held, 2017; Goetze, Andrews, Peijnenburg, Portner, & Norton, 2015; Hirai, Kuriyama, Ichikawa, Hidaka, & Tsuda, 2015). With appropriate sampling, the calculation of within- and betweenpopulation genetic distances can then be used to infer copepod population structure and connectivity (Kozol, Blanco-Bercial, & Bucklin, 2012). These approaches applied on the mesopelagic copepod Haloptilus longicornis at a large spatial scale demonstrated structure stability among the North and South Atlantic gyres and demonstrated the structure stability across 2 years (Goetze et al., 2015). Advanced high-throughput sequencing technologies like RAD-seq now allow the identification of hundreds to thousands of polymorphic loci without a reference genome (Blanco-Bercial & Bucklin, 2016). Recently applied to the calanoid copepod Centropages typicus in North Atlantic Ocean (NAO), this strategy permitted the identification of loci under selection and significant structure in the populations across the NAO. These results support the idea of a high evolutionary and adaptive potential of copepods in the open ocean (Peijnenburg & Goetze, 2013) and slightly modify the previous idea of a weak genetic structure in populations with a high migration rate (Helaouët & Beaugrand, 2009). Although this recent approach provides a new view in copepod population genetics, detected loci under selection could not be directly linked to biological functions due to the lack of a reference genome.

Genome-wide approaches have been applied mostly on humans, plants, animals or microorganisms of agronomic or public health interest for which reference genomes were available. These approaches provide a comprehensive view of genomic regions targeted by selection and are more informative than RAD-seq or other capture-based technologies to accurately identify selective sweeps and distinguish causal mutations from genetic draft (Andrews, Good, Miller, Luikart, & Hohenlohe, 2016). Although next-generation sequencing has reached its golden era, only a few copepod genomes (*Eurytemora affinis, Tigriopus californicus, Caligus rogercresseyi* and *Lepeophtherius salmonis*) have been sequenced and are available, but no genome is available for cyclopoid copepods. This approach remains costly and the investment depends greatly on the genome size of the organisms. Among the pelagic copepods, calanoids possess among the largest genomes, often exceeding several billions of bases (McLaren, Sevigny, & Corkett, 1988; McLaren, Sévigny, & Frost, 1989; Rasch & Wyngaard, 2006; Wyngaard & Rasch, 2000), which does not make them a practical model for a genome-wide approach, despite their ecological importance. Cyclopoids, in contrast, are known to have much smaller genomes (Wyngaard, McLaren, White, & Sévigny, 1995; Wyngaard & Rasch, 2000), although some lineages show complex patterns of genomic variation linked to life stages, likely due to chromatin diminution (Wyngaard, Rasch, & Connelly, 2011).

The cyclopoid copepod genus *Oithona* is considered very abundant and widespread in the world ocean's surface (Gallienne & Robins, 2001). In the past, its abundance was underestimated due to their small size (Clark, Frid, & Batten, 2000; Williams & Muxagata, 2006). This genus plays, however, an important ecological role as grazers and secondary producers in the marine trophic food chain (Turner, 2004), sustaining the growth of commercially important larval fishes such as anchovy (Viñas & Ramirez, 1996) and Argentine hake (Viñas & Santos, 2000).

Within this genus, three species are described as particularly widespread based on morphological identifications (Nishida, 1985): Oithona similis Claus, 1866, Oithona atlantica Farran, 1908 and Oithona nana Giesbrecht, 1892. The present knowledge on the biogeography of Oithona species has been mainly conducted through morphological identification of specimens collected by independent and geographically restricted studies. Oithona similis has been identified from all oceans and climate zones (Razouls, de Bovée, Kouwenberg, & Desreumaux, 2016) and prefers temperatures below 20°C (Castellani, Licandro, Fileman, di Capua, & Grazia Mazzocchi, 2015), which strengthens the speculation that its occurrence in tropical regions may be based on misidentifications (Nishida, 1985). A recent finding has also shown that O. similis is a complex of independent lineages with distinct biogeographies linked to climate zones, and not a single cosmopolitan species (Cornils et al., 2017). Oithona atlantica is also widely distributed and occurs in the temperate and polar oceanic regions of the Atlantic and Pacific Ocean (Cepeda, Blanco-Bercial, Bucklin, Beron, & Vinas, 2012; Nishida, 1985). While the former two species are abundant in temperate to polar waters, O. nana has also been found extensively in tropical and subtropical zones, mostly in coastal regions (Temperoni, Viñas, Diovisalvi, & Negri, 2011; Williams & Muxagata, 2006). The small size of Oithona (<1 mm) and its subtle morphological species-specific traits that can only be observed by microscopy (Nishida, Omori, & Tanaka, 1977) represent a serious difficulty for studies involving a large number of samples. Ribosomal 28S and mitochondrial genes have been successfully used to characterize Oithona species (Cepeda et al., 2012; Cornils et al., 2017; Ueda, Yamaguchi, Saitoh, Orui Sakaguchi, &

Tachihara, 2011) but also to identify invasive species (Cornils & Wend-Heckmann, 2015). This combination of morphological identification and molecular analyses provides robust molecular resources that can be used as a reference for species identification using molecular analysis-only approaches including genome-wide approaches (i.e., metagenomics).

In this study, a global phylogeography for *Oithona* species is proposed based on published records and new metagenomic data produced under the *Tara* Oceans consortium (de Vargas et al., 2015; Vannier et al., 2016). Focusing on *O. nana*, its ~85 Mb genome is presented and compared to other available copepod genomes. Based on its genomic variation landscape throughout the spatial range, the population structure within the Mediterranean Sea is determined, and multiple loci under selection are identified by developing a metagenomic-adapted framework. Finally, the information from the *O. nana* genome and the metagenomic and oceanographic data from the Mediterranean Sea are combined to study the relationships between variations in the allele frequency and the circulation patterns.

# 2 | MATERIALS AND METHODS

# 2.1 | Genome sequencing

Oithona nana individuals were sampled in the small harbour of Toulon, France, in June 2014 with a 90-µm-mesh net and stored in 100% ethanol. For genome sequencing, 2,000 adult individuals were isolated under the stereomicroscope and washed individually in a physiological saline solution. The individuals were transferred by pools of 40 individuals into 1.5-ml tubes (50 tubes in total) containing the alkaline lysis buffer adjusted to pH = 8 (for 10 ml. 9.5 ml H<sub>2</sub>O, 25  $\mu$ l NaOH 10 M, 4  $\mu$ l EDTA 0.5 M, 226.5  $\mu$ l HCl 100% at 1/ 10, 244.5 H<sub>2</sub>O) and ground with a tissue grinder and cooled with liguid nitrogen. The tubes were then incubated for 35 min at 95°C and cooled on ice for 5 min. A total of 20  $\mu$ l of neutralizing solution (Tris-HCl 40 mM, pH 5.0) was added to the tubes. The tubes were then vortexed, centrifuged on a mini centrifuge at 6,400 rpm and kept for 10 min on ice. DNA was purified using Agencourt® AMPure beads by adding 1.5 volumes of Ampure and vortexing. The tubes were left for 5 min at room temperature, then transferred to a magnetic holder; the supernatant was removed and two washes with EtOH 70% were carried out. The ethanol wash was left 30 s before removal. After the ethanol steps, tubes were left open to dry for 10 min before elution in 25  $\mu l$  of DNA-free ultrapure water. Water and beads were mixed and left for 3 min at room temperature and for 2 min on the magnetic holder. After a total of 5 min, the genomic DNA was retrieved with the supernatant and quantified on a Qubit 2.0 (Invitrogen).

To prepare the overlapping paired-end library, 30 ng of genomic DNA from a single vial (40 individuals) was sonicated to a 100–800 base pairs (bp) size range using an E210 Covaris instrument (Covaris, Inc., USA). Fragments were end-repaired and then 3'-ade-nylated. Illumina adapters were added by NEBNext Sample Reagent

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Set (New England Biolabs). Ligation products were purified with 1:1 Ampure XP beads (Beckmann Coulter), and DNA fragments (>200 bp) were PCR-amplified using Illumina adapter-specific primers and Platinum Pfx DNA polymerase (Invitrogen). Amplified library fragments were size-selected to around 300 bp on a 3% agarose gel. After library profile analysis using an Agilent 2100 Bioanalyzer (Agilent Technologies, USA) and qPCR quantification (MxPro, Agilent Technologies, USA), the library was sequenced using 101-bp pairedend read chemistry in a single flow cell on the Illumina MiSeq (Illumina, USA). Raw reads were trimmed for adapters and low-quality bases (Phred value under 20); only trimmed reads longer than 30 bp were kept, producing a final read set of 24.7  $\times$  10<sup>6</sup> paired-end reads corresponding to 2.4  $\times$  10<sup>9</sup> base pairs.

The DNA from the remaining 49 tubes were pooled and used to build three long insert libraries. The three mate pair libraries were prepared following the Nextera protocol (Nextera Mate Pair sample preparation kit, Illumina). Briefly, genomic DNA was simultaneously enzymatically fragmented and tagged with a biotinylated adaptor. Fragments were size-selected (3-5, 5-8 and 8-11 kb) through regular gel electrophoresis and circularized overnight with a ligase. Linear, noncircularized DNA fragments were digested, and circularized DNA was fragmented to 300-1,000 bp size range using the Covaris E210. Biotinylated DNA was immobilized on streptavidin beads, endrepaired, 3'-adenylated, and Illumina adapters were added. DNA fragments were PCR-amplified using Illumina adapter-specific primers and then purified with Ampure XP. Libraries were quantified by qPCR, and library profiles were evaluated using an Agilent 2100 Bioanalyzer (Agilent Technologies, USA). Each library was sequenced using 150-bp paired-end read chemistry on a single flow cell on the Illumina MiSeq. Read sets were trimmed for cleaning as previously described and the sequencing produced finally  $4.8 \times 10^6$ ,  $3.5 \times 10^6$ and 3.3  $\times$  10<sup>6</sup> mate pair reads for 3- to 5-kb, 5- to 8-kb and 8- to 11-kb libraries, respectively.

## 2.2 Genome assembly

To estimate the genome size of O. nana based on the sequencing data, a k-mer spectrum of the genome was built with Kmergenie 1.5692 (Chikhi & Medvedev, 2014) on the paired-end reads. This estimated the O. nana genome size around 85 Mb (Appendix S1). The k-mer profile of the genome did not have the two distinct peaks corresponding to the homozygous (right peak) and heterozygous (left peak) k-mer and thus did not correspond to the canonical profile of a heterozygous genome. This is explained by the pooling of individuals that tends to dilute less frequent heterozygous alleles and thus lowers the first peak. The paired-end reads were assembled with DIP-SPADES 3.5 (Safonova, Bankevich, & Pevzner, 2015) using the -diploid option of the program that merges homologous contigs into one single contig. Contigs over 500 bp were selected for scaffolding by integration of the three Nextera libraries using BESST 1.3.7 (Sahlin, Vezzi, Nystedt, Lundeberg, & Arvestad, 2014) with default parameters. Gaps in scaffolds were closed using GAPCLOSER 1.12-6 with paired-end and mate pair reads. The scaffolds longer than 2 kb were kept in the final assembly. The gene completeness of the assembly was estimated with CEGMA 2.4.010312 (Parra, Bradnam, & Korf, 2007).

## 2.3 | mRNA sequencing and assembly

Additionally, 150 males and 50 females were isolated from the sample of the harbour of Toulon, France (see above), on the stereomicroscope and pooled by sex for total mRNA extraction. mRNA was extracted using NucleoSpin RNAXS from Machery-Nagel. cDNA were then constructed using the Illumina SMRTer Ultra low RNA kit. One paired-end library was built for each sex using the NEB-Next DNA sample PrepReagent Set1 kit from Ozyme. cDNA libraries were sequenced in an Illumina MiSeq. Reads were trimmed as previously described and assembled with VELVET 1.2.07 (Zerbino & Birney, 2008) followed by OASES 0.2.08 (Schulz, Zerbino, Vingron, & Birney, 2012). Redundant contigs were clustered with CD-HIT 4.6.1 using a 95% identity cut-off (Li & Godzik, 2006) producing 40,011 and 39,237 contigs for the female and male transcriptomes, respectively.

## 2.4 Genome annotation

Assembled transcripts were aligned against the O. nana genome using BLAT 36 (Kent, 2002), and refined alignments were produced locally with EST2GENOME 5.2 (Mott, 1997) to produce a first biological evidence for gene prediction. Proteomes from other sequenced and annotated copepod and crustacean genomes were downloaded from public resources. This included the genomic data of Tigriopus californicus, Eurytemora affinis and Daphnia pulex (Colbourne et al., 2011). The proteomes were aligned against the O. nana genome with BLAT and realigned locally with GENEWISE 2.2 (Birney & Durbin, 2000) to produce a second gene prediction. In addition, crustacean proteins from Uniprot (Apweiler et al., 2004) were downloaded and aligned similarly. Gene predictions from mRNA and proteomes were used by GMOVE (Dubarry et al., 2016) to build the gene models. The gene set was represented by 15,359 genes with 23.35% of monoexonic genes. Predicted proteins were translated from the gene models, and a domain search was performed with INTERPROSCAN 5.8-49.0 (Jones et al., 2014).

## 2.5 Comparative genomic analysis of copepods

Genomes, gene annotations and proteomes of two copepods (*T. californicus* and *E. affinis*) and one branchiopod (*D. pulex*) were downloaded from public databases and used for comparative genomic analysis of the *O. nana* genome. Genome and gene structure metrics like number of exon/intron per gene, exon/intron size and monoexonic gene rate were calculated from the ggf files (Appendix S2). Eleven nonredundant metrics were analysed by principal component analysis (PCA) to identify the specific genomic structure of the four crustaceans. Orthologous gene pairs were formed by best reciprocal blast hit (BRH) of each protein against the proteomes using two filters: an alignment length/protein length ratio over 50% and an identity over 30%. The matrix containing the number of BRH between each organism was used to cluster the organisms and to represent their relative distance based on their gene homologies on a dendrogram using hierarchical clustering. Functional protein domains were detected with InterProScan on each proteome, which provided the domain annotations and their possible Gene Ontology (GO). For each proteome, the number of genes classified in GO terms was used to calculate a distance matrix of the crustaceans that was taken as input for hierarchical clustering. The protein domains having a relatively high difference in occurrence among the three copepods over 10) were represented on a heatmap to identify clusters of domains having the same occurrence pattern. An equivalent analysis was performed using the GO terms.

# 2.6 Ribosomal sequences analysis in the *Tara* Oceans samples

Ribosomal 28S corresponding to Oithonidae were downloaded from the NCBI (Appendix S3). To avoid the use of 28S sequences that corresponded to taxonomic assignation mistakes, only sequences associated with published research articles were selected. Nonredundant and sequences without undetermined nucleotides were selected. Ten additional sequences of other Cyclopoida were also added to the data set as an outgroup. Sequences were aligned with MAFFT 7 (Katoh & Standley, 2013) using the progressive method, and most left and most right alignment regions were trimmed to produce a 582-bp alignment. Based on this alignment, a phylogenetic tree was built on the MEGA 5.2 platform (Kumar, Stecher, & Tamura, 2016) with PHYML 3 (Guindon et al., 2010) using a generalized timereversible model and 100 bootstraps to obtain branch support (Appendix S4). The per-base Shannon entropy was calculated along the alignment to define conserved and variable regions that corresponded to Oithona-specific and species-specific regions, respectively (Appendix S5). A matrix identity was built to define the minimum identity threshold to use for species specificity for further metagenomic reads alignment (Appendix S6). A reasonable specificity was reached for a 98% identity threshold for Oithona similis and O. nana, but the discrimination of Oithona atlantica from O. plumifera was not possible. To minimize the sensitivity loss in species identification, we did not use a higher threshold. Each sequence was then considered as a reference and indexed independently with BWA 0.7.12 (Li & Durbin, 2010). Metagenomic reads from Tara Ocean samples corresponding to the fraction size of 20-180 µm were aligned with "bwa mem" against each 28S reference and only reads with identity ≥98% were selected. The maximum depth of coverage in the conserved regions was counted as the total Oithona abundance. The proportion of each species was then estimated and the difference between the total Oithona abundance and the sum of all species abundance was counted as undefined species (Appendix S7). The copy number per genome of the 28S gene was assumed to be fairly uniform for all Oithona species.

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# 2.7 Genomic variant analysis in the Oithona nana populations

Metagenomic reads from Tara Oceans samples corresponding to the 20-180 µm fraction size collected in the surface and deep chlorophyll maximum (DCM; Pesant et al., 2015) were aligned against the O. nana genome using "bwa mem" with a 17-bp seed and stored in one single binary alignment multiple file per station. To avoid spurious mapping, reads with low complexity were discarded with Dust (Morgulis, Gertz, Schaffer, & Agarwala, 2006). Metagenomic reads with an identity cut-off over 80% were selected. Genome coverage at each position was calculated with BEDTOOLS 2.24.0 (Quinlan, 2014). Samples having a mean identity below 95%, or a bimodal distribution of the identity, were discarded (Appendix S8). A second identity filter of 97% was applied, and samples having a mean genomic coverage above  $4 \times$  were kept. The five selected stations that passed these filters (TARA\_10, 11, 12, 24, 26) corresponded to stations where O. nana were previously identified using the 28S sequences (see Section 3). Based on the metagenomic reads alignments, the correlation between the 28S coverage and the genomic coverage was calculated to validate the metagenomic reads mapping and filtering. Variable genomic sites were detected using the samtools/ bcftools pipeline (Li et al., 2009), and loci with a maximum of two alleles were kept. For each sample, the variants were annotated with SNPEFF (Cingolani et al., 2012) in order to assess their genomic location (i.e., exon, intron, UTR, intergenic) and their impact on the predicted proteins (i.e., missense, synonymous variant and nonsense). The distribution of the proportion of the average synonymous and missense variants by gene was modelled by a gamma and exponential distribution, respectively, and outliers (i.e., gene that presented more variant than expected) were tested and p-values were corrected using a strict Bonferroni procedure.

Biallelic sites with a total coverage between  $4 \times$  and  $80 \times$  in the five populations were merged in a single vcf file containing 221,018 genomic positions. The B-allele frequency (BAF) was calculated and used for the pairwise  $F_{ST}$  calculation at each locus; the mean and median pairwise  $F_{ST}$  were used to estimate the genetic distance between the five populations. As the individual genotypes were not accessible, the intrapopulation variance could not be estimated and thus the significance of the  $F_{ST}$  could not be determined. A PCA on the BAF of the five populations was performed to cluster the populations.

The BAF calculated previously was used as input to calculate the  $F_{LK}$  statistic (Bonhomme et al., 2010), which is an improvement of the LK statistic (Lewontin & Krakauer, 1973). Compared to  $F_{ST}$  and LK,  $F_{1K}$  uses as prior a kinship matrix of the populations based on the allele frequencies. As no population could be considered as outgroup, the "midpoint" option was used to build the kinship matrix. The  $F_{LK}$  use assumes that the majority of the variants are under the neutral model and thus the  $F_{LK}$  distribution has to follow a chisquare distribution with a degree of freedom of n-1 (n = number of populations). The neutrality of the variants was tested by comparing the  $F_{LK}$  distribution to the chi-square distribution with df = 4. To

control the *p*-value inflation due to multiple testing, we applied a Benjamini–Hochberg correction to obtain a *a*-value for each variable locus. Loci with a q-value under .2 were considered to be under selection. The genomic scaffolds that contained loci under selection were represented on a Manhattan plot. These loci were then compared to the genome variant annotation to provide a list of genes and biological functions under selection.

### 2.8 Oithona spp. genomic variation and the Mediterranean circulation patterns

Previously, we identified four samples originating from stations located in the southern part of the MS (TARA\_7, 8, 17 and 18) having an identity around 95% and a bimodal distribution of identity. These samples were thought to contain an Oithona species closely related to O. nana but genetically distant enough to be not considered as O. nana (mean identity around 95%). We used the metagenomic reads alignment from the ten stations (TARA\_7, 8, 10, 11, 12, 14, 17, 18, 24 and 26) with a cut-off identity of 90% to detect the genomic variants and selected 754,669 biallelic loci with a valid call in the 10 samples. We calculated the BAF and observed the variation in the BAF with respect to the hydrodynamical connectivity starting from stations located on the Algerian Current (Stations 7 and 8). The stations were sorted from upstream to downstream along the main circulation patterns (Algerian, Lybio-Egyptian and Northern currents) in two possible ways. Way1 follows the order TARA\_7, 8, 14, 12 and 11 and is located only in the western basin. Way2 follows the order TARA\_7, 8, 17, 18, 26 and 24, and starts from the western basin to the Levantine basin and the Adriatic Sea. The variation in the BAF was used to identify genomic clines in the Oithona populations along the two proposed ways. We analysed the variation in the BAF as a function of the Lagrangian distance from TARA 7. Briefly, the Lagrangian distance was computed as the mean travel time between each area over a large ensemble of Lagrangian particles simulation (Berline, Rammou, Doglioli, Molcard, & Petrenko, 2014).

#### RESULTS 3

### Genome assembly and annotation of Oithona 3.1 nana

The O. nana somatic genome was sequenced and assembled in 7,375 contigs with a N50 of 39.6 kb that were linked in 4,626 scaffolds with a N50 of ~400 kb (Appendix S9). After gap closing, only 3.7% of undetermined bases remained. The final genome sequence contains 89% of the 458 conserved core eukaryotic proteins used by CEGMA with an average of 1.2 copies per gene. Thus, the sequencing strategy (i.e., pooled individuals) and the assembly based on dipSpades successfully merged the different haplotypes present in the initial genomic DNA into a single representative haplotype suitable for gene annotation. Low-complexity and repetitive elements represented 3.6% of the genome sequence and were masked <sup>6</sup> WILEY MOLECULAR ECOLOGY

prior to the genome annotation. The genome annotation procedure applied with GMOVE predicted 15.359 genes with 23% monoexonic genes. The resulting proteome was scanned to identify conserved protein domains and 72.3% of the proteins harboured at least one conserved domain present in the INTERPRO database.

# 3.2 Comparative analysis of the Oithona nana genome

To identify O. nana specific genomic features, the structures of the O. nana genome and genes were compared to other available annotated copepod genomes, including the genome of the harpacticoid Tigriopus californicus (which also belongs to Podoplea), the calanoid Eurytemora affinis, and to another crustacean genome, the branchiopod Daphnia pulex. Some copepod somatic genomes are known to be subject to chromatin reduction (Clower, Holub, Smith, & Wyngaard, 2016; Drouin, 2006; Rasch & Wyngaard, 2006; Sun, Wyngaard, Walton, Wichman, & Mueller, 2014; Zagoskin, Marshak, Mukha, & Grishanin, 2010), so for the two copepod genomes used for the comparative analysis, we refer only to their somatic genomes. The PCA of the four crustacean genomes and gene metrics (Figure 1a) showed that O. nana and T. californicus share similar gene and genome structures compared to E. affinis and D. pulex, which form two separated groups (Figure 1b). The podoplean group is characterized by larger exon sizes, higher number of monoexonic genes, lower number of exon by genes, smaller intron sizes, less genes and smaller genes and genome. The construction of orthologous gene pairs (Figure 1c) showed that the podoplean shared more orthologous genes between them (2,911 genes) than with the two other crustaceans. Eurytemora affinis has a large proportion of genes (20,796) that do not have any orthologues with the two podopleans. The clustering of the four crustaceans (Figure 1d) based on the number of orthologous gene pairs produced a dendrogram indicating that calanoids indeed diverged earlier than T. californicus and O. nana. The PCA based on gene and genome metrics and the orthologous gene pair analysis showed that within copepods, the E. affinis genome evolved differently than the podoplean genomes through two possible main events: the appearance of both new introns and genes. These results also showed that podopleans have more compact somatic genomes.

#### 3.3 **Functional protein domains**

The Pfam protein domains found in the three copepods proteomes were linked to the GO database and the distributions of high-level GO terms did not show any specific differences. However, the analysis based directly on the Pfam domain occurrences (Figure 1e) and their related GO biological process (Appendix S10) represented on a heatmap provided a list of domains and biological processes overrepresented in the proteomes. These domains were clustered in five groups: the O. nana group, the E. affinis group, the T. californicus group, the T. californicus and E. affinis group and the O. nana and T. californicus group. The latter two groups contained domains overrepresented in the two species. The O. nana group (Table 1) was represented especially by domains involved in cell differentiation (LNR and seven in absentia domains), multicellular organism development (laminin EGF domain), proteolysis (trypsin and F-box domains) and response to oxidative stress (peroxidase). The proteins harbouring LNR domains (32 proteins) presented domain associations with metalloproteinase (six proteins), or with one or two trypsin domains (six proteins). Furthermore, 18 LNR domain-containing proteins were found to have only LNR domains. Three of the LNR domain-containing proteins found in O. nana were coded by genes localized in a cluster of six genes and all coded trypsin domain-containing proteins, which may result from multiple gene duplications. Other LNR domain-containing proteins are located in different scaffolds. As certain proteins containing only LNR domains reached more than 1,000 amino acids, they may contain unknown functional protein domains.

### Global biogeography of Oithona species using 3.4 metagenomic data

Metagenomic reads sequenced from Tara Oceans samples (Karsenti et al., 2011; Pesant et al., 2015) using the 20-180 µm fraction size collected from the surface and DCM waters were aligned on a manually curated 28S sequence database. The database contained ribosomal sequences from seven different Oithona species (O. similis, O. atlantica, O. plumifera, O. nana, O. simplex, O. davisae and O. brevicornis). Aligned reads with an identity over 98% were selected. This allowed the identification of O. similis and O. nana without ambiguity. Among the Oithonidae, a conserved region of the 28S was identified (Appendix S4). The total coverage obtained in this region was then considered as the total Oithonidae abundance. This allowed the quantification of undefined Oithona species (see Section 2). The Oithona biogeography in the surface waters (Figure 2a) showed a amphitropical distribution for O. similis, which was present in the temperate waters of Northern and Southern hemispheres and Antarctic polar waters. The OTU1 was mostly identified in the tropical and subtropical waters with an exception in one sub-Antarctic sample from station 85. Oithona nana was mostly found in the Mediterranean Sea but was also present sporadically in the Indian (TARA\_39) and Pacific Oceans (TARA\_140). Seven stations located in the Gambier Islands (SPO) showed the presence of Oithonidae but the species could not be determined. Several stations presented an assemblage of O. similis and OTU1 especially in the NAO stations localized along the Gulf Stream, the Brazil Current and also in the

FIGURE 1 Comparative genomic analysis of the Oithona nana genome. (a) principal component analysis (PCA) of the variables based on 11 genomic and gene metrics. (b) PCA of the individuals based on 11 genomic and gene metrics. (c) Venn diagram of the orthologous gene pairs. Numbers indicate the number of best reciprocal blast hit. (d) Hierarchical clustering based on orthologous gene pairs. (e) Heatmap of Pfam domains overrepresented in copepod species. The Pfam domains are clustered by their occurrence z-score



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eastern basin of the MS. Besides O. *similis*, O. *nana* and OTU1, other *Oithona* species present in our reference database have not been identified in any *Tara* Oceans samples.

**TABLE 1** Pfam domains overabundance in the Oithona nana
 genome compared to other copepods

Pfam	Oithona nana	Tigriopus californicus	Eurytemora affinis	Daphnia pulex
Peroxidase (PF00141)	32	3	2	0
LNR domain (PF00066)	47	4	3	6
Seven in absentia protein family (PF03145)	33	9	9	2
Trypsin (PF00089)	170	146	161	268
Laminin EGF domain (PF00053)	161	75	59	85
C1q domain (PF00386)	38	14	8	153
F-box domain (PF00646)	31	5	14	9
FLYWCH zinc finger domain (PF04500)	20	2	2	9

Fewer samples were sequenced from the DCM than from the surface waters (Appendix S11). Comparing the relative abundance of *Oithona* species for the eight stations (TARA\_7, 8, 10, 12, 17, 18, 23 and 25) for which sequencing data from DCM and surface waters were available (Figure 2b), *Oithona similis* was more abundant in the DCM except for station TARA\_23. No specific trend was observed for *O. nana* and OTU1.

# 3.5 | Oithona nana genomic variations in the Mediterranean Sea

The genomic variation landscape of *O. nana* was investigated in five *Tara* Oceans stations (TARA\_10, 11, 12, 24 and 26) located in the northern part of the MS. The genomic coverage obtained from the *O. nana* genome was strongly correlated with the 28S coverage (Pearson's  $R^2 = .99$ ; Figure 3a), which validates the choice of the parameters and the filters applied to select the metagenomic reads corresponding to *O. nana* and also to select the stations that did not provide population admixtures with other *Oithona* species.

*Oithona nana* populations had variants ranging from 608,559 variants in the station TARA\_26, which corresponds to the station



**FIGURE 2** Biogeography of *Oithona* species. (a) Global biogeography of the *Oithona* species using the *Tara* Oceans metagenomic data and 28S sequences. The proportion of each species is represented by a pie chart; asterisks correspond to *Oithona* nana presence with a very low abundance. The MS region is enlarged for clarity. (b) Variation in *Oithona* species abundance depending on the sampling depth in the Mediterranean Sea. The proportion of each species is represented by a pie chart. DCM corresponds to deep chlorophyll maximum



FIGURE 3 Genomic variants in Oithona nana populations of the Mediterranean Sea. (a) Correlation between the 28S and the genomic coverage. Station numbers are plotted; numbers in red correspond to stations discarded due to a bimodal distribution of the identity percentage. Stations in green correspond to stations discarded due to a low genomic coverage. (b) Distribution of the variants in the genome. (c) Distribution of the synonymous variant rate. The red curve corresponds to the gamma distribution estimated from the data. (d) Distribution of the missense variant rate. The red curve corresponds to the exponential distribution estimated from the data. (e) Distribution of the pairwise  $F_{ST}$ . (f) principal component analysis results of the populations based on the B-allele frequency

where O. nana was the less abundant over the five selected stations to 1,059,550 variants (Appendix S12) for the station TARA\_11, which corresponds to the sample where O. nana was the more abundant over the five selected stations. This indicates that the amount of called variants depends on the genomic coverage. Introns represent 20.8% of the genome, and the annotation of the variants

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**TABLE 2** Median pairwise  $F_{ST}$  distances between Oithona nana populations sampled in five stations of the Mediterranean Sea

	Western M	1S basin	Eastern MS basin		
	TARA_10	TARA_11	TARA_12	TARA_24	TARA_26
TARA_10	-	0.05	0.13	0.1	0.22
TARA_11		-	0.11	0.1	0.22
TARA_12			-	0.1	0.09
TARA_24				_	0.14
TARA_26					_

showed less intronic variants than expected comparing to a random distribution of the variants, suggesting that the 97% identity filter used to select the metagenomic reads was too stringent for the intronic regions (Figure 3b). The synonymous variant rate by gene followed a gamma distribution (shape = 2.94, rate = 379.6) and no outliers (genes with more synonymous variants than expected) were detected (Figure 3c). The missense variants rate by gene followed an exponential distribution (rate = 314) and no outliers were detected (Figure 3d).

Among all variable loci detected previously, we selected 221,018 biallelic loci and calculated the BAF and pairwise  $F_{ST}$  to estimate the genomic distance between the five populations. The pairwise  $F_{ST}$  between stations (Figure 3e, Table 2) showed that the populations from the Adriatic Sea (TARA\_24 and 26) were structured and presented moderate differentiation comparing to two populations from the western basin (TARA\_10, 11). We observed a moderate genetic structure within the western basin population group. The lower value was obtained for TARA\_10 and 11 ( $F_{ST} = 0.048$ ), which was expected considering the relatively short distance between the two stations (<100 km). The PCA based on the BAF clustered the Adriatic population from TARA\_10 and TARA\_11. This suggested that the *O. nana* populations are structured between in the MS basins but also within the two basins.

# 3.6 Oithona nana genomic loci under positive selection in the Mediterranean populations

To identify *O. nana* genomic loci under selection, the  $F_{LK}$  statistics was calculated based on the BAFs from the five populations selected previously. The LK and the  $F_{LK}$  globally fitted a  $\chi^2$  (df = 4) distribution (Appendix S13) and thus supported the neutral model. Among the 221,018 biallelic loci tested to be under a  $\chi^2$  (df = 4) distribution, 20 loci had a *q*-value <.2 and were considered under positive selection (Table 3). The BAFs of loci under positive selection showed that most of the loci were under positive selection in populations from TARA\_24 and TARA\_26 stations (Appendix S14). Different patterns of selective sweeps were observed (Appendix S15). Two loci presented a clear soft selective sweep (scaffold\_75 and scaffold 2085); these loci were shown as under selection in the TARA\_24 and 26 populations. Five loci had a hard selective sweep signature (two on

scaffold\_4, one on scaffold\_7 and two on scaffold\_17); for these five loci, the selection occurred only in the TARA\_26 population.

The alleles under selection corresponded to eight synonymous, four missense, five intergenic, two intron and one 3' variant. One of the missense variants (Figure 4a) is located in the GSO-NAT00014698001 gene (scaffold\_2085). The Manhattan plot around this variant presented two drafted variants, one located in the first exon and one in the first intron, suggesting a soft selective sweep signature (Figure 4b,c). The gene product was a 686-amino acid protein presenting one signal peptide and five LNR domains (Figure 4d). The variant was localized on the most N-terminal LNR domain and changes a threonine to a proline (Figure 4e). The RNA-seq reads from the male and female transcriptomes were mapped on the genes and, based on the RPKM values, the expression of GSO-NAT00014698001 was likely to be male specific. Two other missense variants were located in the first exon of GSONAT00014305001 (scaffold\_1229) that codes for a FMRFamide receptor, which is a G protein-coupled receptor (IPR017452) of FMRFamide neuropeptides. The BAF of these two variants showed that selection was occurring in the populations from TARA\_24 and TARA\_26. The scaffold\_1229 contained only three variable loci; thus, the selective sweep pattern around this locus could not be determined. The last missense variant is located in the fourth exon of the GSONAT00006046001 gene (scaffold\_31), which codes a hypothetical protein without known domain. The BAFs of this variant showed that the selection occurs only in the population from TARA 26 and the Manhattan plot suggests a hard selective sweep around this locus (Appendix S15).

# 3.7 Genomic clines between *Oithona* species in the Mediterranean Sea

We extended the previous analysis to integrate five stations (TARA\_7, 8, 14, 17 and 18) located in the southern part of the MS that suggested the presence of an *Oithona* species closely related to *O. nana* but having lower identity (~95%). From the metagenomic reads alignments we selected 754,669 biallelic loci with coverage between  $4 \times$  and  $80 \times$  in all 10 stations to calculate the BAFs, having an identity percentage >90%. Based on the topology of the 28S phylogeny built with consensus sequences from the alignment of metagenomic reads from TARA\_8 (with branching outside the *O. nana* clade; Appendix S16), and on the bimodal  $F_{LK}$  distribution calculated from the BAFs (Appendix S17), we confirmed the presence of another *Oithona* species, closely related, but distinct to *O. nana*.

The populations from stations located in the Southern part of the MS showed BAF medians ranging from 0.54 to 0.82 (Table 4). Populations from stations located in the northern part of the MS presented lower BAF medians ranging from 0 to 0.43. The population from TARA\_11 had a unimodal BAF distribution with a peak at BAF = 0; meanwhile, all other stations had a bi- or trimodal distribution with two peaks at BAF = 0 and BAF = 1, and sometimes a third wide peak between BAF = 0 and 1. There was a decrease in the

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TABLE 3 Genomic location and functional annotation of loci under positive selection in the Oithona nana populations

Scaffold	Position	Ref	Alt	Gene model	Variant	AA modification	Annotation
4	471967	G	А	GSONAT00000985001	Synonymous	p.Ser743Ser	Zinc finger, C2H2 protein
4	723596	А	С	GSONAT00001049001	Synonymous	p.Gly198Gly	Pantothenate kinase
7	175799	Т	А	GSONAT00001735001	Synonymous	p.Arg312Arg	PH domain-like protein
10	237870	Т	А	GSONAT00002382001	Synonymous	p.lle2197lle	Dynein beta chain
10	247465	G	А	GSONAT00002383001	Synonymous	p.Phe19Phe	Hypothetical protein
17	96647	G	А	GSONAT00003499001	Intron		LIM domain protein
17	350150	Т	С	GSONAT00003546001	Synonymous	p.Tyr195Tyr	LIMS1
24	706636	G	А	GSONAT00005133001	3 prime UTR		Hypothetical protein
31	326964	G	Т	GSONAT00006046001	Missense	p.Cys153Phe	Hypothetical protein
56	319206	Т	А	GSONAT00008543001	Upstream gene		Fork head domain protein
61	332115	Т	С	GSONAT00008966001	Synonymous	p.Val255Val	GABA/glycine receptor
62	372141	С	Т	GSONAT00009071001	Synonymous	p.Ser51Ser	Hypothetical protein
75	293884	А	G	GSONAT00009905001	Upstream gene		Hypothetical protein
207	24666	G	А	GSONAT00013216001	Upstream gene		Hypothetical protein
1229	680	Т	А	GSONAT00014305001	Missense	p.Leu64His	FMRFamide receptor
1229	689	С	Т	GSONAT00014305001	Missense	p.Ala67Val	FMRFamide receptor
2085	2429	Т	G	GSONAT00014698001	Missense	p.Thr104Pro	LNR domains protein
4053	516	Т	А		Intergenic		
4053	597	Т	С		Intergenic		
4053	1311	А	G		Intergenic		



**FIGURE 4** Positive selection of variant in the GSONAT00014698001 gene. (a) B-allele frequency value of the loci under selection in the northern stations. (b) Manhattan plot in a 2-kb window around the loci under selection. The dot in red is considered under selection (q-value < 0.2). (c) GSONAT00014698001 gene structure and variable sites. (d) GSONAT00014698001 protein structure. (e) RPKM values of the GSONAT00014698001 gene in males and females

median BAF and of the peak height at BAF = 1 along the Algerian Current (from TARA\_8 to TARA\_17), along the Northern Current (from TARA\_14 to TARA\_11) and also from the Southern Adriatic Sea to its centre (from TARA\_26 to TARA\_24). This peak decrease was associated with an increase in the peak height at BAF = 0 and a shift of the third peak to lower BAF values. The highest BAF values

were observed in the Algerian Current, which transports the surface waters coming from the NAO into the MS through the Strait of Gibraltar. From these results, we hypothesized that the *Oithona* populations from these ten stations contained the other *Oithona* species that was imported from the NAO into the MS through the Strait of Gibraltar. This putative species was more abundant than *O. nana* 

**TABLE 4** Lagrangian distances between stations of the Mediterranean Sea. The distance is calculated from the TARA\_7 according to Berline et al. (2014)

Stations	Latitude	Longitude	Way	Median BAF	Mean BAF	Lagrangian distance (days)
TARA_7	37.048	1.9402	1 and 2	0.54	0.54	38.3
TARA_8	38.004	3.9777	1 and 2	0.75	0.84	98.8
TARA_10	40.641	2.8772	1	0	0.09	592.3
TARA_11	41.168	2.7996	1	0	0.05	538.3
TARA_12	43.351	7.8994	1	0.33	0.34	449.5
TARA_14	39.903	12.8686	1	0.3	0.32	269.8
TARA_17	36.271	14.3061	2	0.75	0.65	344.5
TARA_18	35.749	14.2947	2	0.82	0.71	298.7
TARA_24	42.457	17.9428	2	0.2	0.22	579.9
TARA_26	38.449	20.1813	2	0.43	0.41	671.5

BAF, B-allele frequency.

from the Algerian Current to the beginning of the Lybio-Egyptian Current. The *O. nana* proportion in the populations increased along the Northern Current and after entering in the Adriatic Sea, suggesting a cline between these two species between the northern and the southern MS.

The variation in the BAF distribution was analysed along the Mediterranean currents as a function of the Lagrangian distance (Berline et al., 2014) from the TARA\_7 (Table 4). This variation was analysed along two possible trajectories following the main circulation patterns (Figure 5d). The first trajectory (way1) is located in the western basin; it starts at the beginning of the Algerian Current, going through the Tyrrhenian Sea, merges with the Northern Current and ends in the Balearic Sea; it corresponds to stations TARA\_7, 8, 14, 12, 10 and 11. Along this trajectory, we observed a genomic cline between O. nana and the other species (Figure 5e) with an admixture in the populations from stations TARA\_12 and 14. The second trajectory (way2) goes through the Strait of Sicily and ends in the Adriatic Sea; it corresponds to stations TARA 7, 8, 18, 17, 26 and 24. Along this trajectory, we also observed a genomic cline located in the southern part of the Adriatic Sea with an admixture in the populations from the stations TARA 26 and 24 (Figure 5f).

# 4 | DISCUSSION

# 4.1 | Towards the building of new copepod reference genomes

The availability of the Oithona nana genome opens the door to study the genetics of this highly abundant and widespread genus, and its interactions across the trophic web at the molecular level. The ability to build efficient data sets for genome assembly depends partly on the abundance and quality of the DNA that can be obtained from a single genotype. In the case of small-sized copepods, the DNA obtained from one individual is not sufficient to build small or large insert Illumina libraries (~1 ng/individual). Thus, the assembly of sequences from a pool of individuals of different genotypes and the merging of the different haplotypes in a single "chimeric" one remains the best strategy. In the case of *O. nana*, it led to a final genome assembly with a good completeness and provided a first high-quality genomic reference for cyclopoids. In future, this approach can be used to create new reference genomes for small-sized zooplankton species.

The comparative genomic analysis provided a first insight into copepod genomic evolution. Compared to other available somatic genomes of copepods, the *O. nana* somatic genome is compact and contains less, but larger, introns. However, in our study, no information concerning differences between the somatic and the germline genome is provided. Only a small fraction of the *O. nana* genome is represented by repetitive elements. This could be explained by chromatin reduction during the early differentiation of the *O. nana* embryos, which is known from some freshwater cyclopoid species, and that might be an important driver in genome rearrangement and evolution (Grishanin, 2014). To better know which genomic elements (if any) are excised during the *O. nana* chromatin reduction, further genomic studies should target germline genome analysis.

# 4.2 | Protein domains overabundance and new structures in the *O. nana* proteome

Thirty-two genes coding LNR-containing proteins have been identified in the *O. nana* proteome. The association of LNR domains with metalloproteinase domains is well documented especially in the human pappalysins 1 and 2, which both contain three LNR domains. In humans, pappalysin is known to form a homodimeric complex that lyses insulin growth factor binding protein (IGFPB) and regulates insulin-like growth factor (IGF) availability and its downstream effects, which includes male sexual differentiation (Ventura & Sagi, 2012). The association of LNR with trypsin domains and proteins containing only LNR domains are new characteristics that differentiate *O. nana* from other copepods used in the study. The role of these proteins is unknown, but one possibility would be that LNR-



**FIGURE 5** *Oithona* population genomics in the Mediterranean Sea. (a) B-allele frequency (BAF) distribution of *Oithona* variants in the southern stations (TARA\_7, 8, 17 and 18), northwestern stations (TARA\_10, 11, 12 and 14) and northeastern stations (TARA\_24 and 26). (b) Dominant Mediterranean surface currents. (c) BAF variation along the surface currents of the way 1. X-axis is the Lagrangian distance in days. Y-axis is the BAF. (d) BAF variation along the surface current of the way 2

containing proteins might be involved in the development and sex differentiation of *O. nana* through the proteolysis of IGFPBs. To validate this hypothesis, RNA-seq data analysis including different developmental stages (larvae, copepodite, male and female stages) should be produced. The high number of peroxidases in the *O. nana* proteomes suggests that *O. nana* could be efficient in detoxifying a wide range of products through peroxidation. This could partly explain its capacity to survive in highly polluted areas such as the harbour of Toulon, where the specimens were sampled from. RNAseq experiments analysing the response of *O. nana* to the presence of different pollutants could be performed to identify toxin-specific expression of peroxidase genes.

# 4.3 | Oithona biogeography using the Tara Oceans metagenomic data

Until recently, we lacked a global genetic data set to study the distribution of *Oithona* species across the world. Taking advantage of the *Tara* Oceans metagenomic effort, we extracted reads from the 28S DNA marker from the fraction size compatible with the *Oithona* presence. The analysis of Oithonidae 28S sequences showed that 28S resolution varied depending on the species and that OTU1 contained at least two species. The mitochondrial lineages found recently for *O. similis* (Cornils et al., 2017) were also not visible in 28S. Unfortunately, this does not allow a comprehensive

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biogeography of Oithona species by this method but provides still some new aspects of the Oithona biogeography. The predominance of O. similis in temperate and polar waters illustrates its ecological relevance as a small-sized zooplankton in these oceanic areas. Its absence in tropical regions also confirms previous distribution assumptions (Nishida, 1985). Thus, O. similis is a strong candidate for future genomic efforts. Oithona nana was identified only in a few Tara Oceans samples and mostly in the MS. Despite its worldwide distribution (Razouls et al., 2016), O. nana is limited to coastal waters and, unfortunately, the Tara Oceans project did not focus on such environments. Several samples were identified as containing undefined Oithona spp.; the lack of resolution was partially due to the general lack of references for most of the 44 Oithona species. More efforts have to be undertaken for generating new references for under-represented species in the public databases.

#### Population genomics using metagenomic data 4.4 and the O. nana genome

The use of metagenomic data to identify zooplankton genomic variants at the whole genome level has been performed for the first time, to our knowledge, in this study. Considering the limits of the metagenomic data, we have developed a framework and proposed good practices that will ensure robust and reliable results. The populations of O. nana in the MS seem to be structured between and within basins; however, the intrapopulation genetic differentiation could not be measured.

The loci under selection corresponded to alleles mostly present in the TARA 26 population, which also supports the genomic differentiation occurring in the population at this station. The relatively low amount of loci under selection detected can be partly due to our conservative approach. The presence of loci under selection in the gene coding a LNR domain protein with a sex-biased expression indicated that this gene might play an important role in the O. nana fitness in the populations of TARA\_24 and 26 and thus would be a good candidate for functional genomic analyses.

The identification of genomic clines in the ocean has already been proposed along linear trajectories, and tools have been developed to work at single loci level (Derryberry, Derryberry, Maley, & Brumfield, 2014). Here, however, we proposed a new way to visualize population admixtures by modelling the variation in the BAF by the Lagrangian distance, which enables the modelling of BAF variation along nonlinear trajectories. This approach is more likely to follow genomic variation along gyres. It allowed the identification of two genomic clines located outside the Algerian Current. A question out of reach for our data set is estimating the temporal stability of these clines. Indeed, although the metagenomic data provided by the Tara Oceans expedition brought a snapshot of the population structure in the MS, a time series would greatly help to assess the temporal stability of the observations made, and the consequences for the species connectivity.

#### 5 CONCLUSIONS

The approaches proposed in this study are likely to be efficient on any zooplankton taxon having a tractable genome size and being abundant in samples used for metagenomic sequencing. The availability of the global Tara Oceans data set will allow such analyses to be performed on many important components of the zooplankton community, helping to reveal their distribution and functional properties. The availability of full genomes to study the population structure of zooplankton is a great advantage. In combination with metagenomic data and with the appropriate approach, it will allow for the identification of population structure and loci under selection on different organisms. This would accelerate our knowledge of zooplankton population genomics and provide a better understanding of the molecular mechanisms involved in the adaptation of species to environmental conditions and changes. Another advantage of this approach is the lack of a need to individually check each sample for the species of interest. This characteristic is even more critical when considering small, difficult to identify taxa, allowing the study of any species, and not only those for which identification is possible or easv.

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## DATA ACCESSIBILITY

The metagenomic data from Tara Oceans are available at ENA (Appendix S18). The Oithona nana genome sequence and annotation are available at ENA with the study Accession no. PRJEB18938.

### AUTHOR CONTRIBUTIONS

J.-L.J. and J.P. collected the samples. J.P. performed the molecular analyses. L.B.-B. provided the oceanographic data. M.-A.M., K.S. and M.W. performed the bioinformatics analyses. M.-A.M., L.B.B., A.C., L.S., S.G. and P.W. participated in the data interpretation. M.-A.M.,

L.B.B., A.C. and P.W. contributed to the manuscript. M.-A.M. and P.W. supervised the study.

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