A candidate for the sex-determination gene in tunas (*Thunnus* fishes)

Yoji Nakamura[1,*], Kentaro Higuchi[2,†], Kazunori Kumon[3], Motoshige Yasuike[1], Toshinori Takashi[2],

Koichiro Gen[2], Atushi Fujiwara[4]

[1]Bioinformatics and Biosciences Division, Fisheries Stock Assessment Center, Fisheries Resources

Institute, Japan Fisheries Research and Education Agency, 2-12-4 Fuku-ura, Kanazawa, Yokohama,

Kanagawa 236-8648, Japan

[2]Tuna Aquaculture Division, Aquaculture Research Department, Fisheries Technology Institute,

Japan Fisheries Research and Education Agency, 1551-8 Taira-machi, Nagasaki, 851-2213, Japan

[3]Amami Field Station, Tuna Aquaculture Division, Aquaculture Research Department, Fisheries

Technology Institute, Japan Fisheries Research and Education Agency, 955-5 Hyousakiyamahara,

Setouchi, Kagoshima 894-2414, Japan

[4]Aquatic Breeding Division, Aquaculture Research Department, Fisheries Technology Institute,

Japan Fisheries Research and Education Agency, 422-1 Nakatsuhamaura, Minami-ise, Mie,

516-0193, Japan

*To whom correspondence should be addressed.

Email: yojnakam@affrc.go.jp (Y.N.); Tel. +81 045 788 7673. Fax. +81 045 788 5001.

[†]Current address: General Planning and Coordination Department, Headquarters, Japan Fisheries

Research and Education Agency, 1-1-25 Shin-urashima, Kanagawa-ku, Yokohama, Kanagawa

221-8529, Japan

Abstract

Fish species have a variety of sex determination systems. Tunas (genus *Thunnus*) have an XY genetic sex-determination system. However, the Y chromosome or responsible locus has not yet been identified in males. In a previous study, a female genome of Pacific bluefin tuna (*T. orientalis*) was sequenced, and candidates for sex-associated DNA polymorphisms were identified by a genome-wide association study using resequencing data. In the present study, we sequenced a male genome of Pacific bluefin tuna by long-read and linked-read sequencing technologies, and explored male-specific loci through a comparison with the female genome. As a result, we found a unique region carrying the male-specific haplotype, where a homolog of estrogen sulfotransferase gene was predicted to be encoded. The genome-wide mapping of previously resequenced data indicated that, among the functionally annotated genes, only this gene, named *sult1st6y*, was paternally inherited in the males of Pacific bluefin tuna. We reviewed the RNA-seq data of southern bluefin tuna (*T. maccoyii*) in the public database and found that *sult1st6y* of southern bluefin tuna was expressed in all male testes, but absent or suppressed in the female ovary. Since estrogen sulfotransferase is responsible for the inactivation of estrogens, it is reasonable to assume that the expression of *sult1st6y* in gonad cells may inhibit female development, thereby inducing the individuals to become males. Thus, our results raise a promising hypothesis that *sult1st6y* is the sex-determination gene in *Thunnus* fishes, or at least functions at a crucial point in the sex-differentiation cascade.

Key words: bluefin tuna, sex determination, gene duplication, estrogen sulfotransferase

1. Introduction

Fish species have a substantial variety of sex-determination systems compared to other animals, ranging from environmentally to genetically modulated ones. In the environmental sex determination system, individual sex depends mainly on nongenetic factors such as temperature, growth rate, and density, while in the genetic system, specific genes dominantly control sex differentiation. Regarding sexuality, it is estimated that more than 98% of fish are gonochoristic[1]. Therefore, in most fish, some responsible loci should exist biasedly between males and females or differentially affect gonadal phenotypes, even if the sex is primarily determined by environmental factors. In heterogametic (XY) males or heterogametic (ZW) females, sex chromosomes may be cytologically evident markers as carrying the sex determination loci, but they are often homomorphic in fishes[2], undistinguishable from autosomes by direct microscopic observation. In other words, fish sex chromosomes are not highly differentiated, implying that turnovers may have often occurred over the course of evolution[3]. Recently, sex determination genes have been reported in several fish species, including *DMY/Dmrt1* in medaka[4,5] and Chinese tongue sole[6], *Amhr2* in fugu[7], *sdY* in rainbow trout[8], *Hsd17b1* in yellowtail[9], and *amh* in Patagonian pejerrey[10] and northern pike[11]. These studies suggest that a master gene for sex determination in fish can be easily replaced by another gene, which may be followed by the above-mentioned turnover of the sex chromosome. In particular, the cases in fugu and yellowtail are prominent examples, where only single nucleotide substitutions are critical for sex determination, suggesting that the replacements of master gene occurred only recently in these lineages. Thus, the sex determination genes of fish are often different for each lineage and are not always identified by deductive approaches from model organisms (that is, case studies are required to identify the genes).

Regarding tunas, the fish of the genus *Thunnus* South 1845, it is estimated that Pacific bluefin tuna (*Thunnus orientalis*, PBT) has an XY genetic sex determination system[12]. However, the

chromosome or locus responsible has not yet been identified. One reason for this is that no

distinguishable sex chromosomes were observed in the cytological analysis. It has been reported that

little tuna, *Euthynnus affinis*, may have a ZW sex determination system[13]. These observations

suggest that the sex determination gene of *Thunnus* species has only recently emerged, and therefore,

that the sex chromosomes are not highly divergent. Another reason is the technical difficulty in

handling: since tunas are large and difficult fish to culture, *in vivo* experiments for identifying

sex-associated loci are costly and time-consuming. On the other hand, because tunas have a high

market value worldwide, tuna target fishing and aquaculture have been conducted in many countries.

In aquaculture, the control of the sex ratio in tanks or ocean nets is very important for breeding, as

keeping more females than males leads to an increased production of fertilized eggs. Since tunas do

not show any clear sexual dimorphism, the direct observation of the gonad has been the main

technique for sex identification. However, this is a destructive inspection and is not applicable for

selectively collecting females or removing males in tanks. Therefore, molecular markers associated

with the sex of tuna have been of interest as an alternative for rapid sex identification. In particular,

DNA markers have been considered promising, where a small portion of tissue sections, such as the

fin or skin, are sufficient for PCR assays. A DNA marker associated with PBT sex was reported in

2015[12]. The marker, Md6, was developed from the DNA samples of cultured PBT individuals and

showed an association with sex in the aquaculture population. Regarding the genomic approach, the

PBT male genome data were open[14], but the scaffold sequences were too fragmented for a

genome-wide screening of sex-associated loci. Recently, transcriptomics of southern bluefin tuna (*T.*

maccoyii) have been conducted, and the differentially expressed genes between male and female

gonads (testis and ovary) were examined[15]. However, it should be noted that a differentially

expressed gene between the testis and ovary is not always the sex determination gene, but may be a

downstream gene regulated by the master gene.

In 2019, Suda et al. sequenced the genome of female PBT, compared the assembled scaffold

with that of the male genome, and explored sex-associated regions from the scaffold sequences by

resequencing 31 PBT individuals (15 males and 16 females)[16]. They performed a genome-wide

association (GWA) study focusing on sex-associated single nucleotide variants (SNVs) between

males and females, and identified several regions carrying male-specific alleles. Finally, they

developed three PCR primer pairs for sex identification, namely scaf64_3724604_F/R,

scaf64_3726411_F/R, and scaf64_3724591_F/R, based on male-specific heterozygous SNVs and

short indels detected in the 6.5-kb region of female scaffold 64 (F64). The PCR primers were

designed so that the amplification patterns were different between PBT males and females:

scaf64_3724604_F/R and scaf64_3726411_F/R were amplifiable in males (the sizes were 113 bp

and 143 bp, respectively) but not in females, and scaf64_3724591_F/R was amplified in both males

and females, but the sizes were different (142 bp and 149 bp in males and only 149 bp in females).

PCR amplification using 115 individuals (56 males and 59 females) yielded 100% accuracy of sex

identification, implying that the PBT sex-determination gene may exist around the 6.5-kb region in

F64. They predicted some genes in F64 and discussed the possible involvement in the sex

determination of PBT. However, promising genes, such as those related to the cascade, were not

identified. The potential problem in the previous study was that they found male-specific

heterozygous polymorphisms in multiple scaffolds. Since most sex determinants are often attributed

to a single locus, they suspected that multiple candidates occurred due to assembly errors.

In this study, we improved the male genome and examined the sex-associated regions using

previously published data. We have found a sex-associated gene that is paternally inherited and is

involved in estrogen inactivation. The current results provide the most promising candidate for the

sex determination gene of tuna.

2. Materials and Methods

2.1. Genome sequencing and assembly

A three-year-old male F2 individual of Pacific bluefin tuna, which was cultured at the Seikai National Fisheries Research Institute (currently Fisheries Technology Institute), was collected for genome sequencing. Frozen heart tissue was prepared from the specimen, and DNA was extracted using a DNeasy Blood & Tissue Kit (Qiagen, Venlo, Netherlands). Then, an SMRT-bell template library was prepared following the manufacturer's protocol and sequenced using the Pacific Biosciences (PacBio) Sequel platform (P6C4 chemistry) (Pacific Biosciences, Inc. CA). From the same tissue sample, the DNA was extracted also using the standard phenol-chloroform protocol. A Chromium 10X library was prepared using Chromium Genome Library Kit v2, Genome Gel Bead Kit, Genome Chip Kit v2, and i7 Multiplex Kit (10X Genomics, CA) following the manufacturer's protocol, and the linked reads were sequenced using the Illumina NovaSeq 6000 platform (Illumina, Inc. CA). The PacBio reads were first assembled by HGAP4 (SMRT Link v5.1.0.26412)[17]. The contigs obtained were corrected using NovaSeq linked-reads by Pilon v1.23[18] and Tigmint v1.1.2[19], and finally scaffolded by ARKS v1.0.2[20] in combination with LINKS v1.8.5[21]. The scaffold sequences obtained were submitted to the DNA Data Bank of Japan under the accession nos. BOUD01000001-BOUD01000948. To examine the phased genomic regions, the linked reads were assembled using Supernova2 (v2.1.1)[22]. The former assembly (HGAP4 + ARKS) was assessed by Benchmarking Universal Single-Copy Orthologs (BUSCO) version 4.0.5[23] with a set of Actinopterygii orthologs (actinopterygii_odb10). The genes around the sex-associated region were predicted based on the protein sequences of model fish species in the Ensembl database (release 99)[24], namely *Danio rerio*, *Oryzias latipes*, *Gasterosteus aculeatus*, *Takifugu rubripes*, and *Tetraodon nigroviridis*, by Exonerate v2.4.0[25]. The PBT female genome sequence was obtained from the GenBank database (accession no. BKCK00000000). The nucleotide sequence comparison was

performed by MUMmer v4[26]. The repeat library of PBT genome was constructed by RepeatModeler

Open-1.0, and the repetitive regions were masked by RepeatMasker Open-4.0

(http://www.repeatmasker.org). The duplicated regions were further detected by self-to-self

BLASTN[27] in each of the PBT male and female genomes, and the sequences detected were used also

for masking.

2.2. Genome-wide SNV/CNV analysis

The sequenced reads for 31 PBT individuals (15 males and 16 females)[16] were downloaded from the

NCBI SRA database (accession no. DRR177387). The read sequences were extracted using SRA

Toolkit (https://trace.ncbi.nlm.nih.gov/Traces/sra/sra.cgi?view=software), and then preprocessed

using Trimmomatic v0.36[28] and ParDRe v2.2.5[29], according to Suda et al. Mapping to the scaffold

sequences and single-nucleotide variant calling were conducted using MapCaller v0.9.9.37[30]. After

filtering out inadequate sites (not biallelic, depth < 20), genome-wide association (GWA) between

males and females was estimated through 2×3 contingency tables using the R package, *rrBLUP*[31],

with minor allele frequency > 0.05. Statistical significance was defined as $P < 0.05$ after Bonferroni

correction based on the total number of variant sites examined. For relative depth analysis, raw read

depth per nucleotide site was counted using Samtools (*samtools depth*)[32], and then divided by the

median depth. Copy number variations (CNVs) were detected by CNVcaller[33], where the

above-mentioned mapping data were scanned by a 500-bp window and regional copy numbers were

obtained by merging them in the neighboring windows. The difference in the regional copy number

between males and females was tested using the Mann-Whitney *U* test with Bonferroni correction.

Furthermore, the regions carrying either of the three types of copy numbers (0, 0.5, or 1) among the

31 samples were selected, and the GWA was estimated in the same way as the SNV-based GWA scan

mentioned above.

2.3. Sequence analysis of sex-associated genes

The transcriptome data of southern bluefin tuna[15] were downloaded from the NCBI SRA database

(accession no. SRP059929). The read sequences were extracted using SRA Toolkit, preprocessed by

Trimmomatic, and assembled using Trinity v2.8.4[34]. From the contig sequences obtained,

protein-coding sequences were predicted using TransDecoder v5.0.0[34]. Homologs of PBT genes

were searched using BLASTP[35] from the contig sequences, and the transcriptional variants were

manually checked based on the sequence alignment using MAFFT v7.310[36]. Using the Trinity contig

sequences as a reference, gene expression was measured using RSEM v1.3.1[37]. For molecular

phylogenetic analysis, homologs in other fish genomes were downloaded from the Ensembl database.

The coding sequences were then aligned using MAFFT, where the deduced protein sequences were

aligned and converted into nucleotide sequence alignments. The maximum-likelihood tree was

constructed using RAxML-NG v0.9.0[38].

3. Results

3.1. Genome assembly and validation of sex-associated markers

We constructed the genome sequence of male PBT by *de novo* assembly, yielding a total of 948

scaffolds (>1000 bp) and totaling 827 Mb (Table 1). Using BUSCO for quality assessment, this

assembly completely captured 96.3% of Actinopterygii orthologs (3505 out of 3460). On the other

hand, the score for the female genome was 89.3% (3253 out of 3640), consistent with previous

reports. Using the sex-associated PCR primer sequences reported in a previous study, we performed

a BLAST search against the current male genome, and found that two scaffolds, namely M175 and

M44, carried the regions amplifiable by the primer sets (two male-specific sets,

scaf64_3724604_F/R and scaf64_3726411_F/R, and a common primer set, scaf64_3724591_F/R)

(Table 2). In scaffold M175 (232,647 bp in total), the regions amplified by the three primer sets were

closely located. The estimated amplicon sizes were congruent with those previously observed only in

males: 113 bp for scaf64_3724604_F/R, 143 bp for scaf64_3726411_F/R, and 142 bp for

scaf64_3724591_F/R, respectively. Scaffold M44 (4,583,724 bp in total) had a single region

amplified by scaf64_3724591_F/R, and the estimated amplicon size was 149 bp, which was

equivalent to that observed previously in both males and females. Thus, based on the estimated PCR

products, M175 carried all of the male-specific regions and M44 carried the common haplotype to

both males and females. We compared the nucleotide sequences of M175 and M44, and found that

M175 was almost dissimilar to that of M44 (Fig. 1), while M44 was fully aligned with female

scaffold F64 (Fig. 2), in which the 6.5-kb sex-linked region (SLR) was reported in the previous study.

The 6.5-kb SLR was found also in M44. On the other hand, we found no counterpart of M175 in the

female genome, although the 6.5-kb SLR of M44/F64 (SLR_{M44} or SLR_{F64}) was partially similar to

the 10.7-kb region in M175 (SLR_{M175}) (Fig. 1). We assembled the male genome using Supernova2

and obtained scaffolds corresponding to M44 and M175, respectively (Supplementary Fig. 1). The

M44-like scaffold carrying SLR_{M44} was phased into two pseudo-haploid scaffolds, but SLR_{M44} itself

was homozygotic. On the other hand, the scaffold carrying SLR_{M175} was not phased.

3.2. Read depth analysis

We downloaded the resequencing data of 31 PBT individuals (15 males and 16 females) and mapped

the reads to the current male genome sequence. As a result, both male and female reads were fully

mapped to SLR_{M44} (Fig. 3 and Supplementary Fig. 2). Regarding M175, the female reads were

hardly mapped to SLR_{M175}, in contrast to the male reads. Furthermore, there were consistently fewer

male reads mapped to SLR_{M175} than SLR_{M44}. We computed the median read depths for whole

scaffolds, and thereby converted the read depths of SLR_{M44} and SLR_{M175} into the relative values. In

males, the relative depths of SLR_{M175} were close to 0.5 (Fig. 4). On the other hand, the relative

depths of SLR_{M44} were close to 1 in both males and females. These observations strongly suggest

that, in shotgun sequencing libraries, the DNA content derived from SLR_{M175} in the male samples is

always half that derived from the average scaffolds, reflecting the ploidy or copy number. The

majority of chromosomal regions, except for highly repetitive ones or those of polyploidized

genomes, should exist as singletons in a diploid manner (2n), and the relative depths for many

regions would be approximately 1. Therefore, our observations suggest that SLR_{M175}, with a relative

depth of ~0.5, should exist in a haploid manner (1n) only in males, while SLR_{M44} should exist in a

diploid manner, like many other regions, in both males and females.

3.3. Genome-wide association analysis

Since the results obtained until now appeared to be inconsistent with those previously reported (see

Discussion), we validated the previous mapping and GWA results based on the female genome. We

mapped the 31 resequenced read sets to the female reference genome and re-performed GWA

analysis. As a result, the previous result was roughly reproduced, with significant peaks observed in

multiple scaffolds, including F64 (Fig. 5A). However, when the mapped reads between the female

and present male genomes were compared, over 10% of the reads mapped to female SLR_{F64} in the

15 male samples were found to be potentially derived from SLR_{M175} (Fig. 6). This observation

implies that the reads derived from the male-specific region, such as SLR_{M175}, would have been

incorrectly mapped to paralogous regions in the female genome in the previous study. To avoid the

effect of such cross mapping, we performed the GWA scan again after the duplicated regions were

thoroughly masked by RepeatMasker and BLASTN. This result was in contrast to that from the

unmasked reference: no significant peaks were observed in the masked sequences (Fig. 5B).

Similarly, GWA scans were performed using the current male genome, but no significant peaks were

found in the masked sequences (Supplementary Fig. 3).

We then tested another approach to identify the regions carrying male-specific haplotypes, such

as SLR_{M175}. Using the mapping data for the 31 individuals, we computed copy number variations

(CNVs) across the male genome and explored the regions whose copy numbers were significantly

different between males and females. As a result, only one candidate was found in M175

(18,001–78,750 bp), very close to SLR_{M175}, and the copy number in males was significantly larger

than that in females (Fig. 7A). All of the males had 0.5 copies of the detected region and all of the

females had no copy (i.e., absent), in concordance with the relative depth analysis results (Fig. 4).

We computed genome-wide associations for the haploid regions by converting the copy numbers (0,

0.5, and 1) to three quasi-genotypes (0/0, 0/1, and 1/1). As a result, only one significant peak for this

region was detected in scaffold M175 (Fig. 7B).

3.4. Protein-coding genes in scaffold M175

We scanned the M175 sequence and predicted 12 protein-coding genes (Fig. 8 and Supplementary

Table 1). Of these, two genes, g3 (32,614–64,628 bp) and g4 (76,852–77,963 bp), were located in

the haploid region (18,001–78,750 bp) detected by CNV analysis. The deduced amino acid sequence

of g3 was similar to that of estrogen sulfotransferase encoded by *sult1st6* (e.g., with ~83% identity to

ENSORLP00000007539 of *Oryzias latipes*). Therefore, the homolog of PBT was named *sult1st6y*.

In the case of g4, the deduced amino acid sequence was similar to that of ENSTRUP00000072273

(gene ID: ENSTRUG00000033234) of *Takifugu rubripes*, with ~70% identity. As a "novel gene" in

the Ensembl database, the function was unknown. However, the domain "Integrase, catalytic core"

was predicted by Pfam and PROSITE, and found to overlap with the Gene3D domain "Ribonuclease

H superfamily." With regard to the neighboring genes, the protein sequence of g2 was matched to

ENSTRUP00000068256 (ENSTRUG00000032453, novel gene), with the Pfam domain "PiggyBac

transposable element-derived protein," and g5 was matched to ENSTRUP00000067783

(ENSTRUG00000032600, novel gene) with the Pfam domain "Reverse

transcriptase/retrotransposon-derived protein, RNase H-like domain." Notably, g1 was similar to g5

and matched to ENSTRUP00000067783, suggesting that g2–g4 were sandwiched between

duplicated genes (g1 and g5). In addition, g6 was matched to ENSORLP00000040498

(ENSORLG00000025541, novel gene) with the Pfam domain "Transposase, Tc1-like," and the other

genes, g7–g12, were matched to the same protein, ENSORLP00000044417

(ENSORLG00000028531, novel gene) with the Gene3D domain "Immunoglobulin-like fold." Thus,

only g3 was a functionally annotated gene, and the others were novel or related to transposable

elements. We found no homologs of *sult1st6y* (g3) in the scaffolds M44/F64. Instead, the paralog

was found in male scaffold 30 (M30, 6594208–6602041 bp), named *sult1st6a*, and the nucleotide

and protein identities to *sult1st6y* were 92% and 89%, respectively. Male scaffold M30 corresponded

to a part of female scaffold 47 (F47) (Supplementary Fig. 4), where *sult1st6a* was also found.

To determine whether these *sult1st6* genes are present in other tuna species, we downloaded the

RNA-seq data of southern bluefin tuna (SBT), which were obtained from 10 male testis samples and

10 female ovary samples. We assembled the reads using Trinity and conducted a homology search

against the contigs using PBT *sult1st6y*/*sult1st6a* sequences. As a result, we found the homologs of

sult1st6y/*sult1st6a* in SBT, although the Trinity contigs were originally classified into a single cluster.

We conducted phylogenetic analysis using PBT and SBT *sult1st6* and the homologs in the Ensembl

database (Fig. 9 and Supplementary Fig. 5). The phylogenetic tree showed that each SBT homolog

formed a clade with each of PBT's *sult1st6y*/*sult1st6a*, respectively, suggesting that SBT also had

two paralogs of *sult1st6* and the duplication to *sult1st6y* and *sult1st6a* occurred in the common

ancestor of PBT and SBT. Using the transcript contigs as a reference, we mapped the reads in each

of the 20 samples to those and measured the gene expression levels (Fig. 10). As a whole, the

expression of SBT's *sult1st6y*/*sult1st6a* was low compared to that of the control (0–2% of β-actin in

FPKM). In detail, the expression of *sult1st6a* was observed in both the testis and ovary samples,

although it tended to be low in the latter (0–0.01% of β-actin in FPKM) (Fig. 10A). The expression

of *sult1st6y* was observed in all 10 testis samples, but none of ovary samples, indicating a significant

bias of *sult1st6y* expression between the testes and ovaries ($P < 0.05$, Fisher's exact test) (Fig. 10B).

4. Discussion

In this study, the male genome of Pacific bluefin tuna was sequenced using long-read sequencing technologies. The scaffold sequences assembled were more contiguous than those published in 2013, which were obtained from pyrosequencing and short paired-end reads. Completeness assessment indicates that the current version is better than that of the recent female genome, although the number of scaffolds (948) is larger than that for the female genome (444). Therefore, the current genome is expected to be useful for the validation and extension of previous results regarding the sex identification of PBT. In the previous study, three PCR primer sets were designed from the sequence of female scaffold F64, so that the amplification patterns were different between PBT males and females. In this study, we first searched for the locus amplified by the primer sets in the current male genome, and found two regions: one in scaffold M44 and the other in M175. Based on the results of the large-scale sequence comparison, M44 was found to be the counterpart of F64, while M175 was male-specific. Since M44 and F64 were well aligned with each other, including 6.5-kb SLRs (SLR_{M44}/SLR_{F64}), it is unlikely that large-scale misassemblies are present in M44/F64. The PCR amplification pattern in SLR_{M44}, estimated using primer sequences, was identical to that observed in females. Regarding M175, all the PCR amplicons with male-specific sizes were observed within the 10.7-kb region (SLR_{M175}). It is worth noting that the PCR primer sets were originally designed based on the SNVs predicted in F64 by GWA analysis. Therefore, according to the previous results, M44 and M175 should be allelic to each other. However, these sequences are quite dissimilar to each other. Furthermore, based on the mapping result of resequenced data, the relative read depths to that for the average scaffold data were (SLR_{M44}, SLR_{M175}) ≈ (1, 0) in females but (SLR_{M44}, SLR_{M175}) ≈ (1, 0.5) in males. These estimates indicate that SLR_{M44} should exist in a diploid manner in both males and females, whereas SLR_{M175} should exist in a haploid manner only in males. If SLR_{M44} was allelic to SLR_{M175} in males, the relative read depths

(SLR_{M44}, SLR_{M175}) should be (0.5, 0.5). The result of relative read depth is congruent with that of

phased assembly by Supernova2, where two pseudo-haplotype scaffolds carrying homozygotic

SLR_{M44} were obtained, but only unphased one was obtained for SLR_{M175}. These results indicate that

SLR_{M44} and SLR_{M175} are located at different loci in the male genome, where SLR_{M175} is the

male-specific structural variant (i.e., inserted in males or deleted in females) and is inherited

paternally. In other words, SLR_{F64} (or SLR_{M44}) reported in the previous study was not associated

with PBT sex, although the PCR primer sets designed from SLR_{F64} are still available for sex

identification based on the amplification pattern in SLR_{M175}.

Now, the previous result, in which male-specific heterozygous polymorphisms were detected in

F64, needs to be reconsidered. The previous GWA scan was performed using the female genome as a

reference, focusing on male-heterozygous SNVs or small indels, which may be detectable by the

resequenced short reads. However, M175 found in the current study is a large-scale structural variant

absent from the female genome and should be undetectable by short-read mapping. We considered

the possibility that the reads derived from paralogous loci were cross-mapped to the female reference

genome, causing fake heterozygous SNV calls in genotyping prior to GWA analysis. In the previous

study, the repeat or paralogous sequences were not masked; therefore, it is likely that the reads

derived from the paternal 10.7-kb region (i.e., SLR_{M175}) were mapped to the 6.5-kb region of F64 in

the analysis of male DNA samples. This hypothesis was confirmed by checking the mapped reads: at

least 10% of the male reads mapped to SLR_{F64} in the previous analysis were estimated to be derived

from SLR_{M175}. Furthermore, we compared the GWA results between the two conditions for the

female reference sequence: duplicated regions were unmasked (i.e., raw sequences) and masked. The

result was clear-cut, where the peaks in multiple scaffolds were roughly reproduced in the unmasked

sequences, but no such peaks were observed in the masked sequences. Thus, we conclude that the

previous GWA result was an artifact due to cross-mapping, and many of the scaffolds predicted (e.g.,

F64) were not associated with the sex of PBT. Since we found no significant GWA peaks in the

masked male reference genome, the SLR of PBT would be undetectable from the information of

SNVs or small indels. The current results provide a caveat that traditional GWA analysis, which

targets SNVs using short reads, may not always be sufficient for the identification of SLR in species

with a genetic sex determination system.

Instead of SLR_{M44}, we found that SLR_{M175} is a male-specific locus absent from the female

genome. It should be noted that this finding is due to a homology search of the primer sequences

designed in the previous study. Therefore, it is possible that the current male genome contains other

scaffolds carrying sex-associated structural variants. To check this possibility, we conducted a

genome-wide scan based on a CNV detection scheme using mapping data. As a result, we observed

that only M175 had a 61-kb region (18,001–78,750 bp) where the CNV was significantly different

between males and females. Since this region is very close to SLR_{M175}, eventually the candidate

sex-associated locus was narrowed down to a single region around or including SLR_{M175}. Regarding

the CNV detected, we found that PBT females have no copy, while males have 0.5 copies of the

region, indicating that this region exists in a haploid manner in males, or equivalently, that this

region is paternally inherited. Thus, we conclude that this region (61-kb region + SLR_{M175}) is the

only candidate for the Y-linked locus in PBT. In M175, we predicted a total of 12 protein-coding

genes, two of which (g3 and g4) were included in the predicted haploid region, one (g3) of which

was annotated as encoding estrogen sulfotransferase (SULT1ST6), while the other (g4) was

functionally unknown. We note that g4 has the domain "Integrase, catalytic core" or "Ribonuclease

H superfamily" which is a feature of the retroviral integrase superfamily[39]. Regarding the other 10

predicted genes in M175, the functions are unknown. In particular, g1, g2, and g5 may be involved

in transposons according to domain prediction. Therefore, around the male-specific haploid region,

only the centermost g3, namely *sult1st6y*, is functionally annotated and sandwiched between

possibly transposable elements, implying that the g3 locus may have been unstable and transposed

from the ancestral locus.

The current study suggests that *sult1st6y* is the most convincing gene involved in the sex

determination or differentiation of PBT. The encoding protein, SULT1ST6, belongs to the family of

cytosolic sulfotransferases (SULTs) and has been studied as a detoxifying enzyme in mammals[40].

Regarding fish species, the SULT genes have been investigated mainly in zebrafish, and 20 distinct

paralogs (9 SULT1s, 3 SULT2s, 5 SULT3s, 1 SULT4, 1 SULT5, and 1 SULT6) have been

characterized. Among these, SULT1ST6, one of the nine SULT1 paralogs, displays strict substrate

specificity for estrogens (e.g., estrone). This gene is thought to be involved in organogenesis, such as

the development of the eye and muscle in zebrafish[41]. On the other hand, there is no report about the

relationship between estrogen sulfotransferase and sex development. In fish, steroid hormones are

considered to be the key factor for sex determination[2,42,43], wherein sex can change depending on the

levels of estrogen or androgen production in gonad cells. The gene directly contributing to

steroidogenesis has also been reported as a sex-determination gene in yellowtails[9]. Since endogenous

estrogens are inactivated by sulfation[44], it may not be surprising that the function of *sult1st6* is

involved in sex development. If this gene is expressed in gonad cells at the initiation of sex

development, it may inhibit female development by depleting active estrogens, resulting in male

development. In the present study, we found that *sult1st6y* of PBT was paternally inherited in the

population. It is unlikely that an estrogen-inactivating gene with such a mode of inheritance is

unrelated to the sex development of PBT. In addition, we found that both female and male PBT had

a paralog of *sult1st6y*, namely *sult1st6a*, in male scaffold M30 or female scaffold F47. It is worth

noting that, in the previous study, F47 was another candidate carrying sex-associated SNVs[16], and

the locus of *sult1st6a* was close to the artifact GWA peak. This observation is not only attributable to

cross-mapping, as mentioned before, but also indirectly suggests that the *sult1st6*-like gene might be

associated with the sex of PBT. Since *sult1st6a* is inherited regardless of sex in a diploid manner, we

speculate that *sult1st6a* plays a common role in PBT males and females, for example, in

organogenesis at the early developmental stage, as proposed in the model fish. This suggests that

sult1st6y could have been immune from the original role of *sult1st6* as a redundant copy: after gene

duplication in the ancestor of PBT, the function of *sult1st6y* may have been spatiotemporally

differentiated from that of *sult1st6a* in the proto-paternal line. In fact, it has been reported that a

copy of duplicated genes may be sex-determination gene in fishes[8,10,45]. We found that homologs of

sult1st6y and *sult1st6a* were present in the southern bluefin tuna. Phylogenetic analysis suggested

that gene duplication occurred in the common ancestor of PBT and SBT. The duplication event is

specific to the tuna lineage, not observed in other fishes, except for tandem duplications in some

species. According to the transcriptome, SBT *sult1st6y* was expressed in male's testis but not in

female's ovary. Considering that the expression of *sult1st6a* was at least detectable in females,

although at a much lower level than in males, *sult1st6y* below the detection limit might be originally

absent from SBT females like PBT females. Although this hypothesis will need to be tested by

sequencing the entire SBT genome, our observations suggest that SBT *sult1st6y* may also be

involved in sex development like PBT *sult1st6y*.

The results presented in this study provide an attractive hypothesis for *sult1st6y* being a

sex-determination gene in *Thunnus* fishes, or at least functioning at an important point in the

sex-differentiation cascade. Our hypothesis may be tested by further genetic experiments, although

the handling of tuna in tanks is not easy. Recently, genome-editing technology has been applied to

the mutagenesis of tuna[46]. For example, it may be possible to check whether the sex ratio of larvae is

heavily biased by the knockout of *sult1st6y* in fertilized eggs. Lastly, it is worth emphasizing that the

CNV-based approach used in this study is very useful for identifying a trait-associated region using

short reads when it is involved in large structural variants. In particular, when the region contains

406 recently duplicated sequences, the traditional SNV-based approach may not only miss structural

407 variants but also produce artifacts due to cross-mapping to unassociated regions. In other fish species,

408 sex-associated SNVs have often been observed in multiple scaffolds[47-49], some of which might be

409 cases of cross-mapping of short reads, unless the sexes are polygenically determined. We believe

410 that a combination of traditional SNV- and CNV-based approaches is useful for the identification of

411 sex-associated genes in fish species with a genetic sex-determination system.

Acknowledgements

This work was supported by the Japan Fisheries Research and Education Agency (No. 3BA101). We

would like to thank Editage (www.editage.jp) for English language editing.

References

1.   Pandian, T. J. 2011, *Sex Determination in Fish*. CRC Press.

2.   Devlin, R. H. and Nagahama, Y. 2002, Sex determination and sex differentiation in

418   fish: an overview of genetic, physiological, and environmental influences.

419   *Aquaculture*, **208**, 191-364.

420   3.   Pennell, M. W., Mank, J. E. and Peichel, C. L. 2018, Transitions in sex determination

421   and sex chromosomes across vertebrate species. *Mol Ecol*, **27**, 3950-3963.

422   4.   Nanda, I., Kondo, M., Hornung, U., et al. 2002, A duplicated copy of DMRT1 in the

423   sex-determining region of the Y chromosome of the medaka, Oryzias latipes. *Proc*

424   *Natl Acad Sci U S A*, **99**, 11778-11783.

425   5.   Matsuda, M., Nagahama, Y., Shinomiya, A., et al. 2002, DMY is a Y-specific

426   DM-domain gene required for male development in the medaka fish. *Nature*, **417**,

427   559-563.

428   6.   Cui, Z., Liu, Y., Wang, W., et al. 2017, Genome editing reveals dmrt1 as an essential

429   male sex-determining gene in Chinese tongue sole (*Cynoglossus semilaevis*). *Sci Rep*,

430   **7**, 42213.

431   7.   Kamiya, T., Kai, W., Tasumi, S., et al. 2012, A trans-species missense SNP in Amhr2

432   is associated with sex determination in the tiger pufferfish, *Takifugu rubripes* (fugu).

433   *PLoS Genet*, **8**, e1002798.

434   8.   Yano, A., Guyomard, R., Nicol, B., et al. 2012, An immune-related gene evolved into

435   the master sex-determining gene in rainbow trout, *Oncorhynchus mykiss*. *Curr Biol*,

436   **22**, 1423-1428.

437   9.   Koyama, T., Nakamoto, M., Morishima, K., et al. 2019, A SNP in a steroidogenic

438   enzyme is associated with phenotypic sex in *Seriola* fishes. *Curr Biol*, **29**, 1901-1909

439   e1908.

10. Hattori, R. S., Murai, Y., Oura, M., et al. 2012, A Y-linked anti-Mullerian hormone duplication takes over a critical role in sex determination. *Proc Natl Acad Sci U S A*, **109**, 2955-2959.

11. Pan, Q., Feron, R., Yano, A., et al. 2019, Identification of the master sex determining gene in Northern pike (*Esox lucius*) reveals restricted sex chromosome differentiation. *PLoS Genet*, **15**, e1008013.

12. Agawa, Y., Iwaki, M., Komiya, T., et al. 2015, Identification of male sex-linked DNA sequence of the cultured Pacific bluefin tuna *Thunnus orientalis*. *Fisheries Science*, **81**, 113-121.

13. Yazawa, R., Takeuchi, Y., Machida, Y., et al. 2019, Production of triploid eastern little tuna, *Euthynnus affinis* (Cantor, 1849). *Aquaculture Research*, **50**, 1422-1430.

14. Nakamura, Y., Mori, K., Saitoh, K., et al. 2013, Evolutionary changes of multiple visual pigment genes in the complete genome of Pacific bluefin tuna. *Proc Natl Acad Sci U S A*, **110**, 11061-11066.

15. Bar, I., Cummins, S. and Elizur, A. 2016, Transcriptome analysis reveals differentially expressed genes associated with germ cell and gonad development in the Southern bluefin tuna (*Thunnus maccoyii*). *BMC Genomics*, **17**, 217.

16. Suda, A., Nishiki, I., Iwasaki, Y., et al. 2019, Improvement of the Pacific bluefin tuna (*Thunnus orientalis*) reference genome and development of male-specific DNA markers. *Sci Rep*, **9**, 14450.

17. Chin, C. S., Alexander, D. H., Marks, P., et al. 2013, Nonhybrid, finished microbial genome assemblies from long-read SMRT sequencing data. *Nat Methods*, **10**, 563-569.

18.　Walker, B. J., Abeel, T., Shea, T., et al. 2014, Pilon: an integrated tool for

comprehensive microbial variant detection and genome assembly improvement.

PLoS One, **9**, e112963.

19.　Jackman, S. D., Coombe, L., Chu, J., et al. 2018, Tigmint: correcting assembly errors

using linked reads from large molecules. *BMC Bioinformatics*, **19**, 393.

20.　Coombe, L., Zhang, J., Vandervalk, B. P., et al. 2018, ARKS: chromosome-scale

scaffolding of human genome drafts with linked read kmers. *BMC Bioinformatics*,

19, 234.

21.　Warren, R. L., Yang, C., Vandervalk, B. P., et al. 2015, LINKS: Scalable,

alignment-free scaffolding of draft genomes with long reads. *Gigascience*, **4**, 35.

22.　Weisenfeld, N. I., Kumar, V., Shah, P., Church, D. M. and Jaffe, D. B. 2017, Direct

determination of diploid genome sequences. *Genome Res*, **27**, 757-767.

23.　Simão, F. A., Waterhouse, R. M., Ioannidis, P., Kriventseva, E. V. and Zdobnov, E. M.

2015, BUSCO: assessing genome assembly and annotation completeness with

single-copy orthologs. *Bioinformatics*, **31**, 3210-3212.

24.　Aken, B. L., Achuthan, P., Akanni, W., et al. 2017, Ensembl 2017. *Nucleic Acids Res*,

45, D635-D642.

25.　Slater, G. S. and Birney, E. 2005, Automated generation of heuristics for biological

sequence comparison. *BMC Bioinformatics*, **6**, 31.

26.　Marcais, G., Delcher, A. L., Phillippy, A. M., Coston, R., Salzberg, S. L. and Zimin, A.

2018, MUMmer4: A fast and versatile genome alignment system. *PLoS Comput Biol*,

14, e1005944.

27.　Altschul, S. F., Gish, W., Miller, W., Myers, E. W. and Lipman, D. J. 1990, Basic local

alignment search tool. *J Mol Biol*, **215**, 403-410.

28.   Bolger, A. M., Lohse, M. and Usadel, B. 2014, Trimmomatic: a flexible trimmer for

Illumina sequence data. *Bioinformatics*, **30**, 2114-2120.

29.   Gonzalez-Dominguez, J. and Schmidt, B. 2016, ParDRe: faster parallel duplicated

reads removal tool for sequencing studies. *Bioinformatics*, **32**, 1562-1564.

30.   Lin, H.-N. and Hsu, W.-L. 2019, MapCaller – An integrated and efficient tool for

short-read mapping and variant calling using high-throughput sequenced data.

bioRxiv, 783605.

31.   Endelman, J. B. 2011, Ridge regression and other kernels for genomic selection with

R package rrBLUP. *The Plant Genome*, **4**, 250-255.

32.   Li, H., Handsaker, B., Wysoker, A., et al. 2009, The Sequence Alignment/Map format

and SAMtools. *Bioinformatics*, **25**, 2078-2079.

33.   Wang, X., Zheng, Z., Cai, Y., et al. 2017, CNVcaller: highly efficient and widely

applicable software for detecting copy number variations in large populations.

Gigascience, **6**, 1-12.

34.   Haas, B. J., Papanicolaou, A., Yassour, M., et al. 2013, De novo transcript sequence

reconstruction from RNA-seq using the Trinity platform for reference generation

and analysis. *Nat Protoc*, **8**, 1494-1512.

35.   Altschul, S. F., Madden, T. L., Schaffer, A. A., et al. 1997, Gapped BLAST and

PSI-BLAST: a new generation of protein database search programs. *Nucleic Acids*

Res, **25**, 3389-3402.

36.   Katoh, K., Asimenos, G. and Toh, H. 2009, Multiple alignment of DNA sequences

with MAFFT. *Methods Mol Biol*, **537**, 39-64.

37.   Li, B. and Dewey, C. N. 2011, RSEM: accurate transcript quantification from

RNA-Seq data with or without a reference genome. *BMC Bioinformatics*, **12**, 323.

38.   Kozlov, A. M., Darriba, D., Flouri, T., Morel, B. and Stamatakis, A. 2019,

RAxML-NG: a fast, scalable and user-friendly tool for maximum likelihood

phylogenetic inference. *Bioinformatics*, **35**, 4453-4455.

39.   Nowotny, M. 2009, Retroviral integrase superfamily: the structural perspective.

EMBO Rep, **10**, 144-151.

40.   Suiko, M., Kurogi, K., Hashiguchi, T., Sakakibara, Y. and Liu, M. C. 2017, Updated

perspectives on the cytosolic sulfotransferases (SULTs) and SULT-mediated

sulfation. *Biosci Biotechnol Biochem*, **81**, 63-72.

41.   Yasuda, S., Liu, C. C., Takahashi, S., et al. 2005, Identification of a novel

estrogen-sulfating cytosolic SULT from zebrafish: molecular cloning, expression,

characterization, and ontogeny study. *Biochem Biophys Res Commun*, **330**, 219-225.

42.   Nakamura, M. 2010, The mechanism of sex determination in vertebrates-are sex

steroids the key-factor? *J Exp Zool A Ecol Genet Physiol*, **313**, 381-398.

43.   Yamamoto, T. 1969, Sex Differentiation. In: Hoar, W. S. and Randall, D. J. (eds), *Fish*

Physiology, Academic Press, pp. 117-175.

44.   Raftogianis, R., Creveling, C., Weinshilboum, R. and Weisz, J. 2000, Estrogen

metabolism by conjugation. *J Natl Cancer Inst Monogr*, 113-124.

45.   Matsuda, M. and Sakaizumi, M. 2016, Evolution of the sex-determining gene in the

teleostean genus Oryzias. *Gen Comp Endocrinol*, **239**, 80-88.

46.   Higuchi, K., Kazeto, Y., Ozaki, Y., et al. 2019, Targeted mutagenesis of the ryanodine

receptor by Platinum TALENs causes slow swimming behaviour in Pacific bluefin

tuna (*Thunnus orientalis*). *Sci Rep*, **9**, 13871.

47.   Dong, C., Jiang, P., Zhang, J., et al. 2019, High-density linkage map and mapping for

sex and growth-related traits of largemouth bass (*Micropterus salmoides*). *Front*

Genet, **10**, 960.

48.   Star, B., Torresen, O. K., Nederbragt, A. J., Jakobsen, K. S., Pampoulie, C. and

Jentoft, S. 2016, Genomic characterization of the Atlantic cod sex-locus. *Sci Rep*, **6**,

31235.

49.   Fowler, B. L. and Buonaccorsi, V. P. 2016, Genomic characterization of

sex-identification markers in *Sebastes carnatus* and *Sebastes chrysomelas*

rockfishes. *Mol Ecol*, **25**, 2165-2175.

Figure legends

Fig. 1. Sequence comparison between PBT male scaffolds M175 (X-axis) and M44 (Y-axis). Left

panel indicates the full-size comparison (232,647 bp vs. 4,583,724 bp), and the boxed region is

enlarged at right panel. In the right panel, SLR_{M44} and SLR_{M175} are highlighted in gray.

Fig. 2. Sequence comparison between male scaffold M44 and female scaffold F64. The 6.5-kb SLRs

are indicated with arrows, respectively.

Fig. 3. Mapped read depths around SLRs in resequenced PBT samples. For each of the female

(DRR177382) and male (DRR177383) samples, SLR is highlighted in gray. The read depths for all

the 31 samples are shown in Supplementary figure 2.

Fig. 4. Comparison of relative read depths between males and females for SLR_{M44}/SLR_{M175}. The

mapping of resequenced reads was conducted using an unmasked male reference.

Fig. 5. Genome-wide association with the sex of PBT using the female reference sequences. For the

unmasked (A and C) and masked (B and D) references, Manhattan plot and Q-Q plot are shown,

respectively. In Manhattan plots, genome-wide significance cutoffs based on Bonferroni correction

are indicate by a red line, and the significant peak in scaffold F64 is indicated by a triangle. *P*-values

lower than 10^{-15} are treated as 10^{-15} for convenience.

Fig. 6. Classification of the resequenced reads mapped to SLR_{F64} in the female genome.

Fig. 7. Genome-wide association with copy number between PBT males and females. The mapping

of resequenced reads was conducted using a masked male reference. The plots on scaffold M175 are

indicated by triangles. (A) Differences in regional copy number between males and females are

denoted as the values of $-\log_{10}(p)$ in the Mann-Whitney U test. Upward plots indicate that the copy

number is larger in males than in females, while downward plots indicate the inverse. Genome-wide

significance cutoffs based on Bonferroni correction are indicated by dashed lines. (B) Manhattan

plot (left) and Q-Q plot (right) from CNV-based GWA scan. The regions with copy number 0, 0.5, or

1 were selected (P-values lower than 10^{-15} were treated as 10^{-15}). In the Manhattan plot,

genome-wide significance cutoff based on Bonferroni correction is indicated by a red line.

Fig. 8. Protein-coding regions in scaffold M175. The region predicted with a copy number of 0.5 and

10.7-kb SLR_{M175} are shown in red and black, respectively.

Fig. 9. Phylogenetic tree of *sult1st6* in fish species. For each of the nodes, the bootstrap probability

is indicated when it is >95%. The tree constructed using more homologs linked with the Ensembl

IDs is shown in Supplementary Fig. 5.

Fig. 10. Expression of *sult1st6* in southern bluefin tuna's gonad cells. (A) *sult1st6a* and (B)

sult1st6y.

Tables

Table 1. Assembly statistics of PBT genomes

	This study	Previous study*
Number of scaffolds	948	444
Total scaffold size (Mbp)	827	787
N50 scaffold size (Mbp)	13.2	7.9
BUSCO completeness (%)	96.3	89.3
Single copy BUSCOs (%)	93.6	86.1
Duplicated BUSCOs (%)	2.7	3.2

*Accession no. BKCK00000000.

590 **Table 2. Amplified sizes of sex identification PCR primer sets**

Primer set	This study		Amplified size in the previous study (bp)	
	M44	M175	Female	Male
scaf64_3724604_F/R	-	113	-	113
scaf64_3726411_F/R	-	143	-	143
scaf64_3724591_F/R	149	142	149	142, 149

Figures

Fig. 1

Fig. 2

Fig. 3

Fig. 4

Fig. 5

A

B

C   **D**

615   **Fig. 6**

619 **Fig. 7**

A

B

Scaffold (M1, M2, M3, ...)

623   **Fig. 8**

627   **Fig. 9**

0.10

629
630

631 **Fig. 10**

634