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RESEARCH ARTICLE

Efficient sex separation by exploiting differential alternative splicing of a dominant marker in *Aedes aegypti*Shih-Che Weng¹, Igor Antoshechkin², Eric Marois³, Omar S. Akbari^{1*}

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Data Availability Statement: Complete sequence maps and plasmids are deposited at Addgene.org (#200012). All Illumina and Nanopore sequencing data has been deposited to the NCBI-SRA (PRJNA985064). All data used to generate figures are provided in the Supplementary Materials/Tables.

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Abstract

Only female mosquitoes consume blood giving them the opportunity to transmit deadly human pathogens. Therefore, it is critical to remove females before conducting releases for genetic biocontrol interventions. Here we describe a robust sex-sorting approach termed SEPARATOR (Sexing Element Produced by Alternative RNA-splicing of A Transgenic Observable Reporter) that exploits sex-specific alternative splicing of an innocuous reporter to ensure exclusive dominant male-specific expression. Using SEPARATOR, we demonstrate reliable sex selection from early larval and pupal stages in *Aedes aegypti*, and use a Complex Object Parametric Analyzer and Sorter (COPAS) to demonstrate scalable high-throughput sex-selection of first instar larvae. Additionally, we use this approach to sequence the transcriptomes of early larval males and females and find several genes that are sex-specifically expressed. SEPARATOR can simplify mass production of males for release programs and is designed to be cross-species portable and should be instrumental for genetic biocontrol interventions.

Author summary

Female mosquitoes, exclusive blood-feeders and carriers of dangerous human diseases, necessitate elimination before implementing genetic biocontrol methods. Enter SEPARATOR (Sexing Element Produced by Alternative RNA-splicing of A Transgenic Observable Reporter), a robust sex-sorting approach with key attributes: (i) harnessing male-specific expression through sex-specific alternative splicing (SSAS) of a safe, bright fluorescent marker; (ii) early larval sex-sorting and beyond; (iii) adaptable high-throughput sorting with COPAS; (iv) independence from sex-chromosome linkage; (v) genetic stability, resistant to meiotic recombination or chromosomal rearrangements; (vi) allowing positive selection of males for added reliability; (vii) transferable to various species through ubiquitous sex-specific alternative splicing, cross-species compatible promoters, and markers; and (viii) enabling early-stage mosquito separation for efficient male mosquito

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Competing interests: I have read the journal's policy and the authors of this manuscript have the following competing interests: O.S.A. and S.W. have filed a patent on this technology. O.S.A. is a founder of Agragene, Inc. and Synvect, Inc. with equity interest. The terms of this arrangement have been reviewed and approved by the University of California, San Diego in accordance with its conflict of interest policies. All other authors declare no competing interests.

production. SEPARATOR reliably separates sexes during *Aedes aegypti* larval and pupal stages, and facilitates transcriptome sequencing of early larval males and females, revealing sex-specific mosquito genes. This method streamlines male production for release programs, offering cross-species adaptability to support genetic biocontrol initiatives.

Introduction

The mosquito is the most deadly animal on the planet, estimated to have killed roughly 50% of humans since the dawn of humanity [1]. This year, roughly 700 million cases of mosquito transmitted diseases worldwide shall occur resulting in over a million deaths [2]. Insecticides and larvicides have traditionally been used to control mosquitoes, however mosquitoes have evolved resistance [3–7], and harmful chemicals are unfortunately poisoning our environment [8–10] and killing non-target species such as pollinators [11–13]. Moreover, a warming global climate is expanding habitable ranges of mosquitoes and their pathogens resulting in an increased number of people at risk of contracting mosquito transmitted pathogens [14–16]. Given these issues, innovative technologies are critical to combat this expanding global threat.

To genetically suppress mosquito populations, several biocontrol strategies have been developed including the classical sterile insect technique (SIT) [17], release of insects carrying a dominant lethal (RIDL) [18], female specific RIDL (fsRIDL) [19–23], Wolbachia-based incompatible insect technique (IIT) [24], the precision guided sterile insect technique (pgSIT) [25], Ifegenia (inherited female elimination by genetically encoded nucleases to interrupt alleles) [26], and homing-based suppression gene drives [27]. The ultimate goal for each of these approaches is to scalably release modified mosquitoes into the environment to safely achieve sustained species-specific population suppression. Given that only female mosquitoes consume blood and transmit pathogens, exclusive release of male-only cohorts is critical. While some of these approaches have built-in self-sexing mechanisms (e.g. gene drives [27], fsRIDL [23], Ifegenia [26], pgSIT [25]), others require laborious manual separation of females prior to final release (e.g. classical SIT, Wolbachia-based IIT [24]) significantly reducing scalability. Moreover, for Wolbachia-based IIT any accidental female releases can undermine the intervention [28,29], underscoring the imminent need for efficient and reliable sexing.

Sex-sorting mosquitoes can be done manually, however this is laborious, error-prone, and not scalable for genetic biocontrol interventions. In *Aedes* and *Culex* mosquitoes, sexual dimorphism of pupa size can aid sex separation [30,31], however pupal size is density-dependent requiring optimized rearing conditions. To overcome this limitation, AI-assisted optical adult sex-sorting systems have been developed that can differentiate adults based upon sexual dimorphic features with impressive accuracy [32]. However, these have only been developed in *Aedes aegypti* and require sorting at the fragile adult stage which is not ideal, slow, and difficult to scale. Alternatively, selectable markers have been genetically linked to sex chromosomes in *Anopheles* [33–37], or to sex-determining loci in *Aedes* [38–40]. However, genetic linkage is often broken by meiotic recombination, or translocations, making these strains less stable when scaled [17,41]. Strains have also been developed using sex-specifically expressed promoters in mosquitoes [22,42–44] to express fluorescent proteins in the gonads, however given the small size of the gonads the expression is often weak and stage-specific [45]. There has also been efforts to exploit sex-specific alternative splicing (SSAS) to enable red fluorescent protein (RFP) expression in the flight muscles in *Aedes* [20], or to bias green fluorescent protein (EGFP) expression in larvae in *Anopheles* [46,47]. However, these sexing strains are engineered using species-specific components making them less portable across species. Additionally, the

expression patterns are often not strong, or early enough, to allow for reliable sorting in initial larval stages which would be ideal for COPAS sorting and for genetic biocontrol interventions. Taken together, the development of simple, stable, and reliable sex-sorting technologies that can be facilely engineered in multiple mosquito species and enable early larval sex sorting remains to be developed.

Here we exploit the sex specifically alternative spliced intron within *Ae. aegypti doublesex* (*AaeDsx*), which is a highly conserved transcription factor involved in sex determination of insects, to enable robust sex-specific alternative splicing of EGFP. We call our approach SEPARATOR (Sexing Element Produced by Alternative RNA-splicing of A Transgenic Observable Reporter). SEPARATOR exploits SSAS of a widely expressed fluorescent reporter to provide positive selection of males that can be integrated into genetic biocontrol interventions. To engineer SEPARATOR, any intron that is sex-specifically spliced could be utilized. SEPARATOR has many desirable features including: (i) it exploits male specific expression via sex-specific alternative splicing (SSAS) of an innocuous bright fluorescent marker; (ii) it enables sex-sorting during early larval development and beyond; (iii) is adaptable for high-throughput sorting using COPAS; (iv) does not rely on sex-chromosome linkage; (v) is genetically stable and not prone to breakage by meiotic recombination or chromosomal rearrangements; (vi) it enables positive selection of males to further increase robustness; and (vii) is facilely portable to alternate species as it utilizes the process of sex-specific alternative splicing which is used throughout the insect kingdom in addition to transposable elements, promoters, and markers that are cross-species compatible; and (viii) it enables separating mosquitoes at early stages such as L1, which allows the breeding facility to use space and food more efficiently to raise male mosquitoes only. Using SEPARATOR, we demonstrate positive identification of male larvae in *Aedes* mosquitoes, as early as mature embryos and beyond. By harnessing the capabilities of COPAS, we demonstrate sorting of over 100,000 EGFP+ males with speeds of up to 740 larvae/minute, achieving a EGFP-negative female contamination rate between 0.01% to 0.03%. Taken together, this method provides a much needed tool to scale and reliably release males for genetic biocontrol interventions.

Results

Engineering SEPARATOR

To generate SEPARATOR a sex-specific alternatively spliced intron derived from the *AaeDsx* gene was utilized (Figs 1A and S1A). The male specific *AaeDsx* intron is ~26.5 kb which is difficult to amplify from genomic DNA and quite large for transgenesis mediated by *piggybac* transposition. Therefore, we truncated this intron by preserving splicing factor binding sites including Tra/Tra-2 and RNA binding protein 1 (RBP1) binding sites to retain the sex-specificity of this intron [48]. This resulted in a smaller *AaeDsx* intron of 4.5 kb in size (Figs 1A and S1A). The reading frame was initiated by adding a start codon with a Kozak sequence, expressed using a constitutive *Hr5IE1* AcMNPV baculovirus promoter previously shown to work in many species [49–56]. To open the reading frame, nine stop codons located in endogenous exon 5b were excluded (S6 Table). The coding sequences for EGFP and DsRed were strategically designed to overlap, allowing for their expression in a sex-specific manner. The DsRed coding sequence was designed to be in-frame with a female-specific product (exon4, engineered exon5b, and exon6) to control female-specific DsRed expression. In addition, the male-specific splicing product, involving exon 4 and exon 6, was designed to be in-frame with the EGFP coding sequence (S1 Fig).

The SEPARATOR construct was then introduced into the mosquito genome to generate a genetic sex-sorting strain via the *piggyBac* transposon. The intended plan was to ensure that

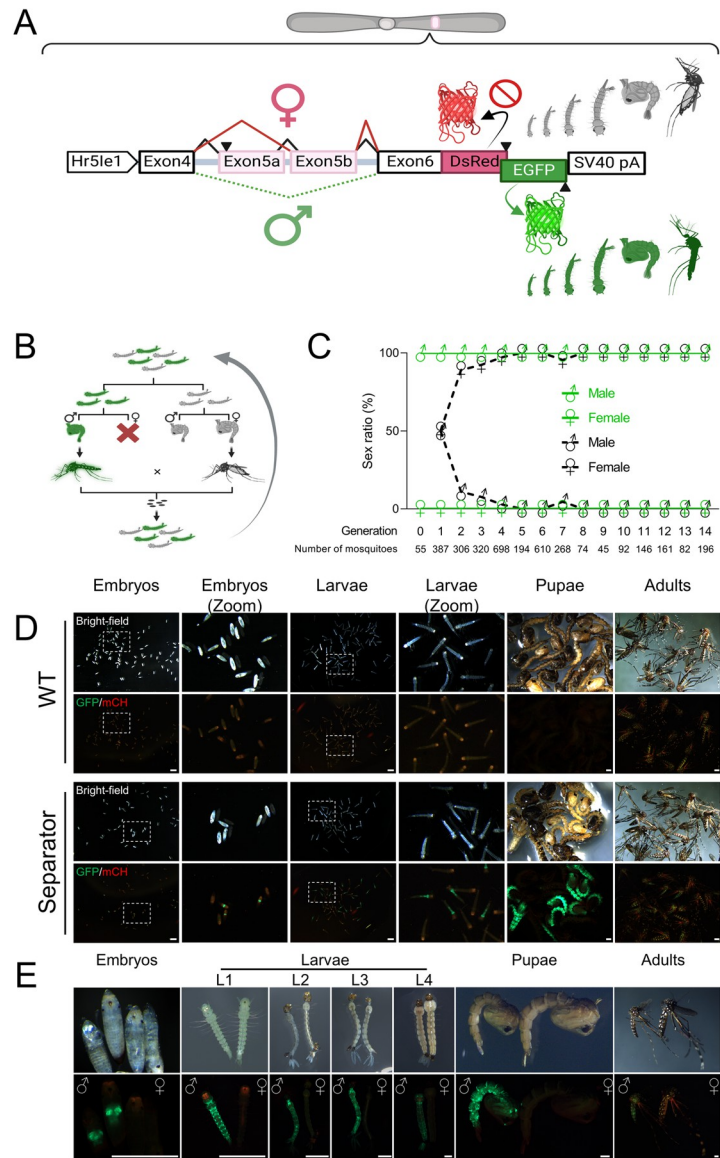


Fig 1. SEPARATOR in *Ae. aegypti*. (A) The sex-specific splicing module of AaDsx was used to construct SEPARATOR in *Ae. aegypti*. The expression of SEPARATOR was driven by the constitutive baculovirus promoter, Hr5Ie1. The male-specific splicing product was in-frame with the EGFP coding sequence, while inclusion of stop codons in exon 5b prevented in-frame expression of the DsRed in females. The SV40 pA served as the polyadenylation signal. The construct is not to scale. Figure was created using BioRender. (B) Strategy for generating homozygotes. GFP-positive larvae were sorted and the sex of each was determined at the pupal stage. GFP-positive males were then crossed with GFP-negative females in order to produce homozygotes. Figure was created using BioRender. (C) GFP-positive mosquitoes are male exclusively. Mosquitoes were sorted by their GFP signal at the larval stage and used a microscope to examine the sex ratio based on the morphological differences in genital lobe shape at pupal stage, which are specific to each sex. (D) The embryo, larva, pupa, and adult stages of wild-type (Liverpool) and SEPARATOR mosquitoes were collected and photographed using a fluorescent stereomicroscope (Leica M165FC). Eggs, aged between 24–48 hours after being laid, were subjected to a 15–30 minute treatment with 30% NaOCl solution (containing approximately 3.6% active chlorine at the final concentration) to remove the chorion and enable visualization of the embryo. Eggs were hatched in deionized water within a vacuum chamber, and the resulting hatched larvae were then collected as L1 larvae. Scale Bar (white) = 1mm. (E) The developmental stages of mosquitoes were collected and photographed using a fluorescent stereomicroscope (Leica M165FC). The images consist of two panels: the upper panel displays the bright-field images, while the lower panel showcases the GFP/mCH channel images. Scale Bar (white) = 0.5mm.

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all mosquitoes expressing EGFP would be male, while those expressing DsRed would be female. Interestingly, the results following microinjection revealed that all 55 EGFP-expressed larvae were male at the pupal stage in G0 (S1 Table). However, no DsRed-expressed larvae were observed in G0. All the pupae from G0 were sexed and resulting adults were crossed with wild-type mosquitoes, and stable transgenic lines were selected by the fluorescence marker (G1). In G1-onward, similar results were observed, where 100% of the EGFP-positive larvae were male.

To validate the sex-specific splicing pattern of the *AaeDsx* splicing module, a comprehensive analysis was carried out utilizing reverse transcription polymerase chain reaction (RT-PCR) and RNA sequencing. A total of fifty EGFP-positive L1 larvae and fifty EGFP-negative L1 larvae were collected for further analysis. To perform RT-PCR, we utilized primers designed to target the 3' end of the *Hr5IE1* promoter and the 5' end of the EGFP sequence (S1A Fig). Subsequently, Sanger sequencing was carried out to analyze the obtained PCR products. Our results showed that the utilization of truncated intron 4, engineered exon 5b, intron 6, and exon 6 sequences in RNA splicing exhibited sex-specificity (S1B Fig). Both Sanger sequencing and RNA sequencing (RNA-seq) analysis yielded comparable results, aligning with our anticipated splicing patterns (S1B and S2 Figs). The sex-specific RNA splicing pattern indicated the female splicing product being in-frame with the DsRed coding sequence, while the male splicing product resulted in (-1) frameshift, leading to the DsRed coding sequence being out of the frame and in-frame with the EGFP coding sequence. Interestingly, both the RT-PCR and RNA-seq analyses revealed that the predominant products observed in females comprised exon4, exon5b, and exon6 (S1B and S1C Fig and S3 Table). Notably, these exons were found to be in-frame with the DsRed coding sequence (S1B and S2 Figs). Therefore, it can be inferred that the expression level of transcripts specific to females and the splicing pattern of female-specific products do not present any obstacles to DsRed expression. However, DsRed signals were not observed in the transgenic larvae.

We determined transgene integration sites (S3 Fig) and generated a homozygous line. To do this, larvae were sorted by fluorescence and separated into two groups, EGFP-positive and EGFP-negative, then the sex ratio of these two groups was examined at the pupal/adult stage. The EGFP-positive males were crossed to EGFP-negative females to enrich for homozygotes (Fig 1B). In 15 generations, we manually screened a total of 3635 EGFP+ larvae and confirmed the resulting sex at the pupa and adult stage. Remarkably, 100% of the EGFP+ larvae were male (Fig 1C and S1 Table). Furthermore, we conducted an analysis of survival rate statistics encompassing the full developmental journey from egg to adulthood. Our findings clearly indicated that there was no significant difference in survival rates between the SEPARATOR and wild-type (Liverpool) mosquito populations (S4 Fig). In summary, the results demonstrate that the SEPARATOR technology is an efficient and effective way of separating male (EGFP+) and female mosquitoes (EGFP-), which could have important implications for broad adaptation of SIT for mosquito control.

Measuring efficacy of sex sorting at scale

To evaluate the applicability of SEPARATOR during the entire life cycle of mosquitoes, we proceeded to explore the timing of EGFP expression. We found that strong EGFP signals were expressed from late embryo all the way through to the adult stage of the mosquitoes (Fig 1D and 1E). In addition, when compared to the wild-type control (Liverpool), the EGFP intensity of SEPARATOR mosquitoes is strong enough to differentiate between EGFP-positive (male) and EGFP-negative (female) in a pooled condition from the early stage of mosquito's life cycle

(Fig 1D). Based on these results, it can be concluded that SEPARATOR is a powerful and robust system for mosquito sex sorting.

To evaluate the suitability of SEPARATOR for automated sex sorting, we conducted fluorescence-based flow cytometry sorting on batches of 10–30 thousand first instar larvae using COPAS. This generated a fluorescence diagram where male larvae expressing EGFP formed a distinct cluster, clearly separate from the EGFP negative female larvae (Figs 2 and S5). The EGFP-positive larvae were selected and sorted in pure mode at flow rates ranging from 20 to 70 objects per second. Even at this high flow rate, we were able to recover 70–80% of the EGFP-positive larvae, resulting in sorting speeds of 740 larvae/minute (S2 Table). In total, 108,570 larvae were sorted using COPAS from generations G7 to G9. After a single sorting, a single instance of 0.1 to 0.45% contamination of EGFP-negative (female) larvae was observed within the male population (S2 Table). While slower flow rates could potentially yield a more complete recovery of males and minimize or eliminate contamination with females, the high sorting speed represents a compromise between recovery rates and the production speed required for mass production [57]. To address the issue of female contamination, additional measures were implemented. Through quality control sorts, the contamination rate of EGFP-negative larvae (females) was successfully reduced to 0.01–0.03% (S2 Table). This was accomplished by subjecting the sorted larvae, a total of 78,861 individuals at G9, to a second round of sorting using the COPAS. This second sorting phase specifically targeted objects that deviated from the EGFP-positive gate, employing the "enrich mode" for enhanced precision. It is worth noting that these experiments were conducted using an older SELECT COPAS instrument model from 2005. Utilizing a more modern COPAS instrument with an upgraded laminar flow and electronic controls, is expected to further reduce these reported female contamination rates. Taken together, this method allowed us to efficiently and effectively sort a large number of larvae, providing valuable insights into the performance of our sex sorting system.

Sex-enriched genes identification

Previously, sex determination in mosquitoes during the larvae stage has presented challenges, necessitating the reliance on sex-specific morphological characteristics in pupae and adults for precise identification. Consequently, earlier transcriptome analyses primarily concentrated on investigating the sex-related aspects of pupae and adult stages [58–61]. While there have been some limited studies successfully distinguishing sexes at the L3 and L4 larval stages by assessing the expression of the male determinant factor, Nix, this method requires individual PCR testing of larvae to detect Nix and determine the sex of individual mosquitoes before proceeding with RNA-seq analysis [60].

In order to gain valuable insights into the molecular mechanisms controlling sex determination and differentiation during the early developmental stages of *Ae. aegypti* mosquitoes, we employed SEPARATOR to separate male and female L1 larvae. Subsequently, RNA sequencing was conducted to identify genes exhibiting sex-specific expression patterns. Using the data we collected, we conducted a comprehensive analysis of differential gene expression (DGE). Our findings revealed that, at the early L1 larvae stage, 1082 genes exhibited male-enriched expression patterns, while 634 genes exhibited female-enriched expression patterns (S6C Fig). Subsequently, the sex-enriched genes were subjected to enrichment analysis. Among the male-enriched genes, two distinct clusters emerged based on Gene Ontology (GO) terms. The first cluster was related to cilium and microtubule formation (including terms such as cilium, axoneme, microtubule-based process, and cell projection), while the second cluster was associated with cuticle formation (S6D Fig and S5 Table). Moreover, among the female-enriched genes,

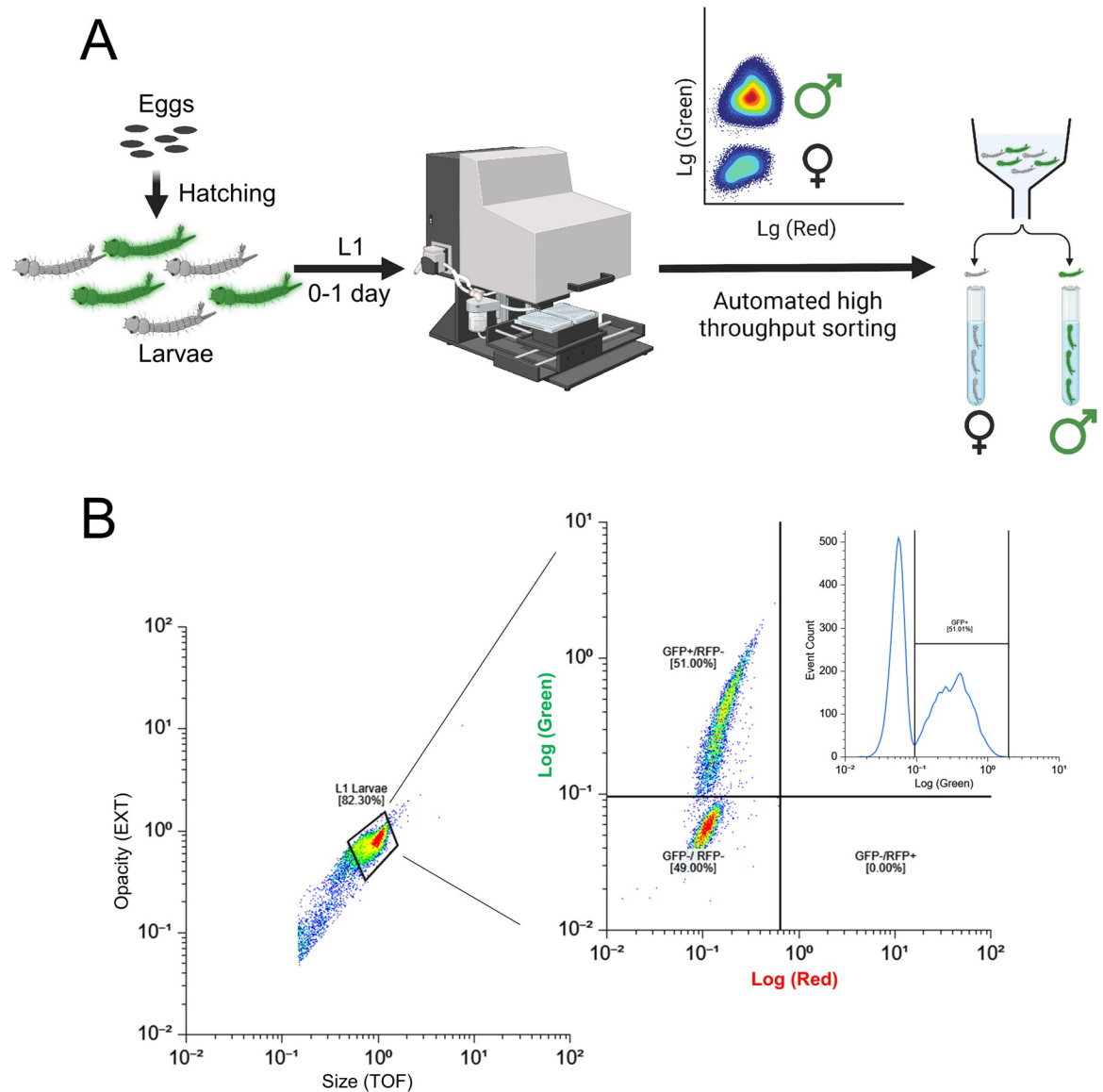


Fig 2. Precise sex-sorting at scale using COPAS. (A) A schematic diagram of large-scale sex-sorting processes using COPAS is shown. The eggs of transgenic mosquitoes, which have been engineered with the SEPARATOR system, were incubated in a vacuum chamber filled with deionized water to hatch them. 24 hours post-egg hatching, the larvae expressing GFP were screened using the COPAS instrument. The GFP-positive larvae were then carefully sorted, and raised in a controlled environment until they reached adulthood. Once the adults have reached maturity, their sexes were verified through various methods. Figure was created using BioRender. (B) The eggs of transgenic mosquitoes that were genetically engineered to carry the SEPARATOR system were incubated in a vacuum chamber using deionized water. After 24 hours of incubation, the hatched larvae were passed through a COPAS instrument. To ensure accurate sorting, the larvae were selected based on both their opacity and size, and then sorted by the intensity of their GFP expression.

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several distinct clusters emerged based on GO terms, including immune response, metabolic processing, and cuticle formation (S6E Fig and S5 Table).

Following RNA-seq analysis of L1 larvae, we compared our transcriptomic data at the L1 larvae stage with previously collected data from the L3, L4, pupae, and adult stages of mosquitoes [60]. To determine the overlap between the SEPARATOR set and the other six comparisons, we generated an UpSet plot representing shared sex-enriched genes across all developmental stages (S8 and S9 Figs and S9 and S10 Tables). In our analysis, we have

identified a significant number of genes that were not detected in any of the comparisons performed by previous studies [60]. This finding suggests that some of these genes may represent early expressed genes that are later turned off in subsequent stages, making them difficult to identify in previous studies.

In order to further explore the investigation of sex-enriched genes during various developmental stages of mosquitoes, we performed GO enriched analysis on the list of sex-enriched genes at different developmental stages. However, we observed a limited number of genes displaying sex-enriched patterns specifically in the L3 and L4 larval stages. Furthermore, when analyzing Matthews's RNA-seq dataset, we found no significant difference in the expression level of a well-known male determinant factor, Nix [61], between L3 males and L3 females. This discrepancy could potentially be attributed to the lower sequencing depth in Matthews's RNA-seq data (approximately 7 million reads per sample) compared to our L1 stage dataset (approximately 25 million reads per sample) (S7 Fig and S7 Table). Additionally, to ensure consistency with samples from other stages, we excluded the dataset derived from adult mosquitoes that had been dissected and isolated to obtain independent samples. As a result, we conducted GO enriched analysis on the sex-enriched gene list for the L1 larvae and pupae stages of mosquitoes. Our results indicate a consistent enrichment of genes involved in cilium and microtubule formation in males throughout the developmental stages of mosquitoes, ranging from L1 larvae to late pupae. Notably, cytoskeleton organization-related GO terms were identified during the early to mid pupae stages. Moreover, GO terms associated with spermatid development and sperm DNA condensation were identified during the late pupae stage of mosquito development (Figs 3 and S10 and S11 Table). These results suggest that sperm development is a continuous process from the early developmental stage (L1 larvae) to the late developmental stage (late pupae) in mosquitoes. For female-enriched genes, we observed a notable emphasis on GO terms associated with DNA replication and DNA repair specifically in female pupae (Fig 3 and S10 and S11 Tables).

Previously, it was challenging to determine the sex of larvae. As a result, previous transcriptome analyses relied on separating sexes after the pupae stage, which caused the loss of sex-specific samples during early developmental stages. In this study, we utilize our sex-specific RNA-seq results to compare them with a previously collected dataset of variable developmental stage RNA-seq data [59] (S12 and S13 Tables). To assess the expression of sex-specific genes during early development (prior to the pupae stage), we initially analyzed the genes identified through mfuzz clustering analysis, specifically focusing on those designated as L1 or L2-L4 specific. Cluster 17 consisted predominantly of genes expressed in L1, while cluster 1 encompassed genes expressed in L2-L4 (S11 Fig). Using a membership cutoff of 0.75, we found that cluster 17 contained 268 genes and cluster 1 contained 383 genes. Among these, 73 (27%) and 134 (35%) were determined to be sex-specifically expressed (S14 and S15 Tables). To expand our investigation beyond the mfuzz clusters, we examined genes that exhibited no expression (TPM values below 1) in carcass, testes, ovary, or pupae, but displayed TPM values above 1 (S16 Table) or 10 (S17 Table) in first instar larvae. These were considered early-expressed genes that were not detected at later stages. We identified 210 and 93 such genes in the respective datasets. Among these, 76 (36%) and 46 (49%) were identified as sex-specifically expressed (S16 and S17 Tables). These findings are highly promising and contribute valuable insights.

In summary, our comparison with the developmental transcriptome data demonstrates our ability to identify genes expressed during early developmental stages, such as L1, which was previously unattainable [59]. Furthermore, the comparison with Matthews' sex-specific data reveals that the differentially expressed genes we have identified exhibit both overlap with known genes and a significant number of new sex-specific candidates, and these may prove useful for future investigation.

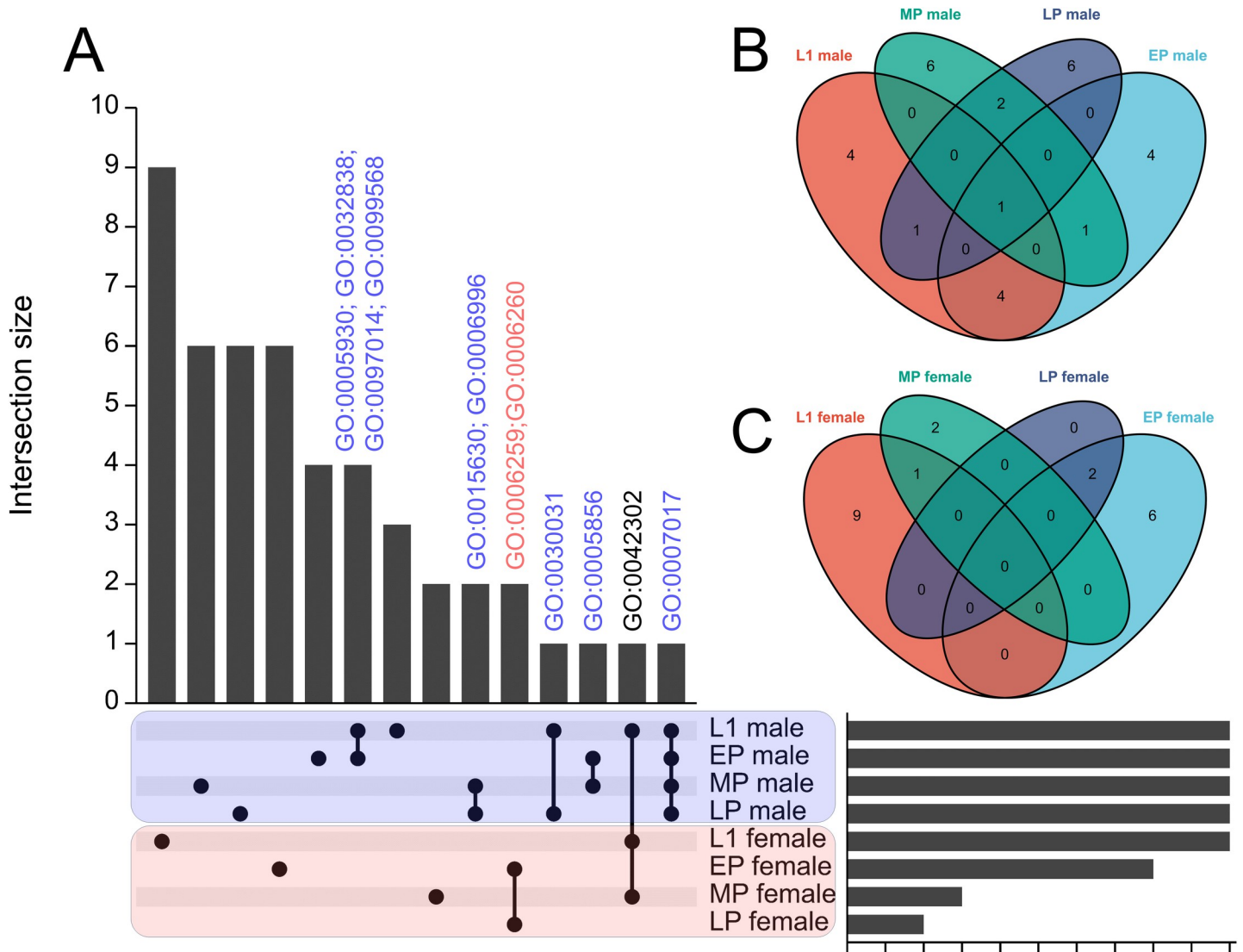


Fig 3. Comparing the transcriptome across larvae and pupae stages of mosquito. SEPARATOR mosquitoes were utilized to individually segregate male and female mosquitoes at the L1 larval stage using the GFP signal. Following separation, total RNA extraction and RNA-seq analysis were performed. The analysis of the early pupae (EP), mid pupae (MP), and late pupae (LP) stages was conducted using data from a previous study. Sexing at the pupae stages relied on sex-specific morphological differences. Sex-enriched genes were identified using DESeq2 and then performed GO enrichment analysis. The shared genes between the L1 stage and all other comparisons were determined, and visualizations such as (A) UpSet plots and (B-C) Venn diagrams were created to represent these shared genes. The common GO terms across various developmental stages of mosquitoes are labeled above the bar. GO:0005930 axoneme; GO:0032838 plasma membrane bounded cell projection cytoplasm; GO:0097014 ciliary plasm; GO:0099568 cytoplasmic region; GO:0006996 organelle organization; GO:0006259 DNA metabolic process; GO:0006260 DNA replication; GO:0030031 cell projection assembly; GO:0005856 cytoskeleton; GO:0042302 structural constituent of cuticle; GO:0007017 microtubule-based process.

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Discussion

Efficient and scalable sex separation is critical in the process of utilizing insects for genetic bio-control [17]. To make this approach more sustainable and cost-effective, it is important to improve methods for sex separation. In this study, we present a highly efficient method for selecting male larvae/pupae in *Aedes* mosquitoes called SEPARATOR. This approach utilizes a COPAS instrument to positively select male L1 larvae that express a dominant male-specific reporter gene (EGFP). Importantly, this was designed as a positive-selection system to ensure

that only those larvae expressing the dominant male-specific EGFP are precision sorted. Therefore, if EGFP becomes mutated or breaks, those individuals will not be selected making this system incredibly robust. Moreover, the use of a male spliced intron further increases the robustness since females will not have the ability to properly splice this intron to generate EGFP.

In comparison to existing techniques, SEPARATOR has several advantages, including its exceptional efficiency, precision, and potential for portability across multiple species. In fact SEPARATOR only relies on a few simple components that have been shown to function in many insects. These include a transposable element for genetic transformation—here we use *piggybac* but there are many other choices that could also work including mariner, minos, Hermes, p-element, CRISPR-HDR etc. Another component is a strong ubiquitous promoter that expresses early in development that can drive expression of the *dsx*-EGFP cassette. Here we use a baculovirus promoter Hr5ie1 that has been shown to work in many insects—but this could be swapped out for an alternative species-specific promoter if desired. The most important component is the sex-spliced intron and here we use a DSX derived intron from *Ae. aegypti*. Given that DSX is a highly conserved gene in insects and known to undergo sex-specific alternative splicing indicates that introns from this gene derived from species of interest will likely work for SEPARATOR. Notwithstanding, any intron that is sex-spliced in the species of interest could also work—it will just need to be carefully designed and tested. Finally, EGFP could also be swapped out for other dominant markers or even desirable genes that could benefit from our sex-splicing module. Taken together, SEPARATOR encodes a few components that should make it readily adaptable to other species.

In *Aedes*, there is a distinct size differential between female and male pupae, with females being larger. This characteristic allows for pupae to be size-sorted through a sieve, which serves as the first step in sex-sorting. While this method is effective in separating the sexes, up to 2–5% of female pupae can still remain in the male-enriched batch. To further reduce the number of female mosquitoes, a secondary sex-sorting step is employed using an AI-assisted optical system [31,32]. This system utilizes visual cues from sexual dimorphic differences in adult mosquito morphology to identify and remove any remaining female mosquitoes. This second step significantly reduces female contamination rates to an incredibly low level of 0.02% to $1.1310^{-7}\%$ [62]. However, it should be noted that this step is done at the adult stage, which is not ideal for sorting as adults are very fragile. As a comparison, sorting SEPARATOR expressing larvae using a single COPAS instrument can sort up to 36K larvae per hour which really makes this a scalable approach.

There were a few unexpected results associated with SEPARATOR. During the 15 generations reported, no DsRed-expressed mosquitoes were observed. Previous research has shown that in *D. melanogaster* and *Ae. aegypti*, the presence of the fruitless (*Fru*) protein is not detected in females, despite the expression of the corresponding transcripts [63–65]. Furthermore, a study conducted in *D. melanogaster* has revealed that the translation of the *fru* female splicing product is suppressed by the *Tra* protein [64]. This finding suggests that perhaps the transcripts specific to females are not translated. In *D. melanogaster*, both *Dsx* and *Fru* function as sex-determining factors and are regulated by the *Tra* protein. Nevertheless, proving the inability of a gene to undergo translation presents significant challenges. As a result, uncertainty persists regarding whether *Dsx* follows a comparable mechanism of translation inhibition, emphasizing the necessity for additional investigation. Fortunately, the male-specific product of *AaeDsx* demonstrates successful functionality (Fig 1C–1E). Additionally, our objective is to generate a positively selected population of males to enhance reliability and ensure accurate sex sorting. Hence, considering the next generation of SEPARATOR, utilizing

it for positive male selection and incorporating a ubiquitous expression system for a transgenic marker could be a viable approach.

SEPARATOR is robust and can be easily adapted for use in both classical Sterile Insect Technique (SIT) and *Wolbachia*-based Insecticide-Treated Insect Technique (IIT) [24,28,29] (Fig 4). The current method for breeding male mosquitoes involves culturing both sexes to the pupal / adult stage for sex sorting, after which the female mosquitoes are removed. In the context of *Wolbachia*-based IIT, the precise release of only males is crucial. The inadvertent release of females can compromise the effectiveness of the intervention [28,29], highlighting the urgent requirement for accurate sexing methods. However, current methods are not as efficient as SEPARATOR. SEPARATOR utilizes less time for male-sorting at the L1 larvae stage, making it a more efficient use of breeding space and food to raise male mosquitoes. The rapidity of COPAS sorting allows for multiple iterations of screening, effectively minimizing the risk of female contamination. With this system, researchers and breeders can save time and resources by identifying and separating male mosquitoes at an early stage of development. This allows for a more efficient and cost-effective method of breeding and raising male mosquitoes for research and other purposes. Taken together, SEPARATOR provides a valuable tool to help revolutionize the way we sort sexes, making the process more efficient, cost-effective, and reliable and may prove to be a valuable addition to genetic biocontrol programs.

Materials and methods

Molecular cloning and transgenesis

To create the endogenous *AaeDsx* splicing module construct, we amplified the fragment of endogenous exons and introns from the genomic DNA of *Ae. aegypti* using PCR. We then linearized the previous mCherry and EGFP containing plasmid, 1122I, using the restriction enzyme *PacI*. The linearized 1122I plasmid and the fragment of endogenous exons and introns were used in a Gibson enzymatic assembly method to build the 1174CX plasmid. To open the reading frame of the female-specific product and allow for in-frame expression of the mCherry coding sequence, we substituted the endogenous exon 5b with an engineered exon 5b that had the stop codons removed. The sequence of the engineered exon 5b was synthesized using the gBlocks Gene Fragment service. We removed the endogenous exon 5b by cutting it with the restriction enzymes *PmlI* and *SnaBI*, and then used Gibson assembly to incorporate the engineered exon 5b containing fragment into the cut 1174CX plasmid, resulting in the 1174C plasmid. To generate a plasmid for sex-specific expression of DsRed and EGFP, we amplified the fragment of the engineered exon 5b and DsRed coding sequences from the 1174C plasmid and the previous 874Y plasmid. We then fused these two fragments together using overlapping PCR. Finally, we used omega PCR to substitute the sequence from the mCherry coding sequence to the 3xP3 promoter in the 1174C plasmid with the DsRed coding sequence, resulting in the 1174D plasmid. During each cloning step, we selected single colonies and cultured them in LB medium with ampicillin. We then extracted the plasmids (using the Zymo Research Zippy plasmid miniprep kit) and performed Sanger sequencing. The final plasmids were maxi-prepped (using the Zymo Research ZymoPURE II Plasmid Maxiprep kit) and fully sequenced by Primordium. All primers are listed in S18 Table. The complete annotated plasmid sequences and plasmid DNA are available at Addgene (ID: 200012). Transgenic lines were created by microinjecting preblastoderm stage embryos with a mixture of the piggyBac plasmid and a transposase helper plasmid. Four days after microinjection, the G0 embryos were hatched and the surviving pupae were separated and sexed. The pupae were placed in separate cages for males and females, along with wild-type male pupae in the female cages and wild-type female pupae in the male cages, in a 5:1 ratio. After several days to allow for development

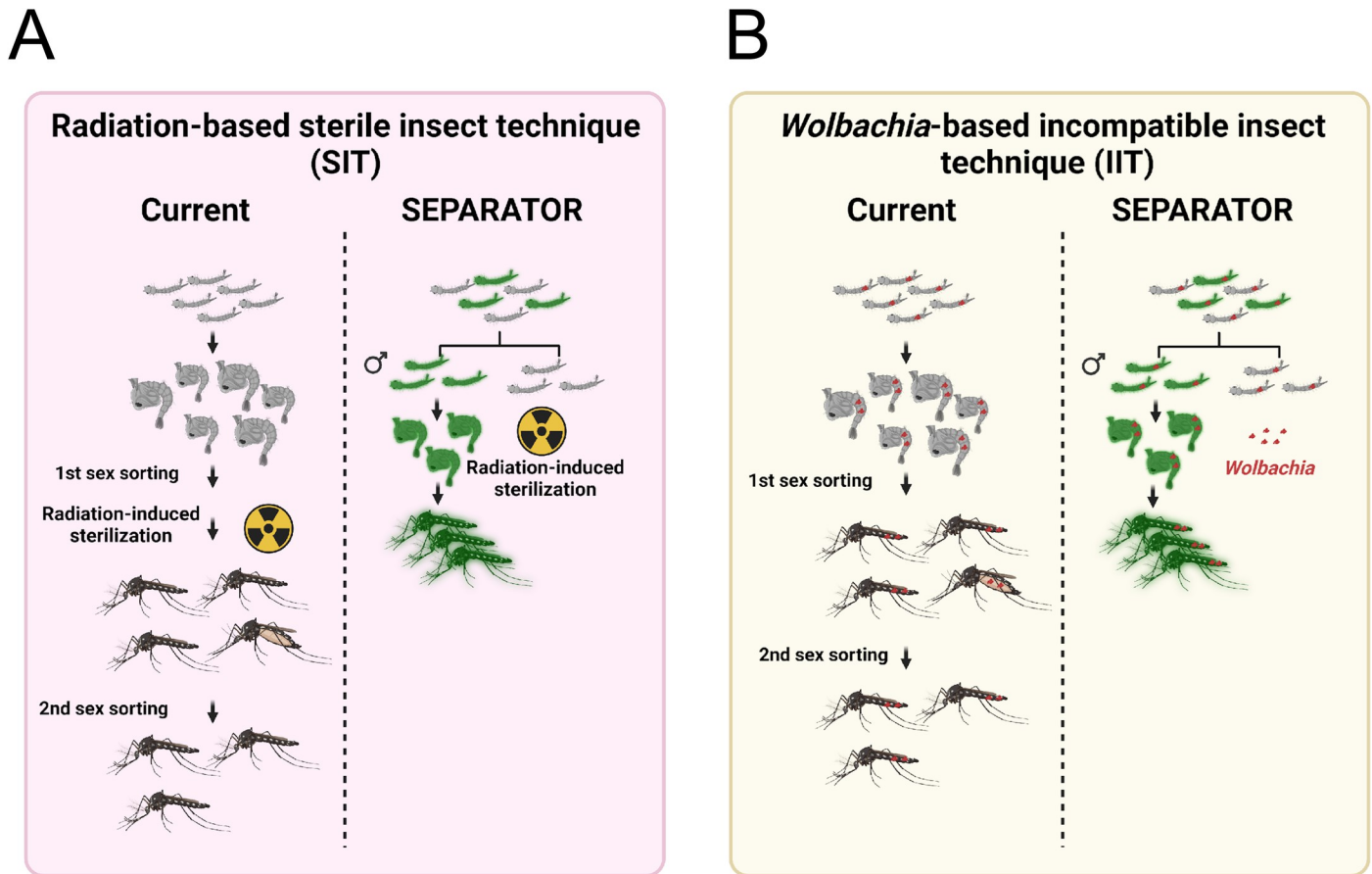


Fig 4. SEPARATOR provides a more simplified and economical sex-sorting of *Ae. aegypti* mosquitoes than the currently available two-step sex-sorting approaches. (A) The process of generating radiation-induced sterile male mosquitoes begins with the cultivation of mosquitoes. The larger female pupae are removed using a sieve. However, it should be noted that smaller female pupae may still remain after the first sex sorting. Once the mosquitoes have been irradiated, emerging adult mosquitoes are screened out by an image recognition AI that has been trained to discriminate between female and male adult morphologies during the second sex sorting. The SEPARATOR approach utilizes a male-specific reporter (GFP) to positively select male L1 larvae. This can be done using the COPAS instrument, which is capable of high-throughput selection at a speed of up to 10 larvae per second. By removing female larvae early in the development process, SEPARATOR supports a more efficient production of males for SIT application. Furthermore, SEPARATOR allows for the transportation and release of irradiated sex-sorted pupae. This means that adult male mosquitoes can emerge directly into the environment without incurring additional fitness costs from handling and transportation. (B) The *Wolbachia*-based incompatible insect technique (IIT) utilizes a two-step sex-sorting approach for sorting the *Wolbachia*-infected male mosquitoes currently in use. The process of generating *Wolbachia*-infected SEPARATOR mosquitoes is relatively simple, as it involves crossing *Wolbachia*-infected female mosquitoes with SEPARATOR male mosquitoes. The resulting *Wolbachia*-infected male L1 larvae that express a male-specific reporter (GFP) are then positively selected using the COPAS instrument. Figures were created using BioRender.

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and mating, a blood meal was provided and eggs were collected, aged, and hatched. The larvae with positive fluorescent markers were isolated using a fluorescent stereomicroscope. To isolate separate insertion events, male transformants with fluorescent markers were crossed with female transformants without fluorescent markers, and separate lines were established. The individual genetic sexing lines (1174D) were maintained as mixtures of homozygotes and heterozygotes, with periodic elimination of wild-type individuals. The genetic sexing line (1174D) was homozygosed through approximately ten generations of single-pair sibling matings, selecting individuals with the brightest marker expression each generation.

Mosquito rearing and maintenance

Ae. aegypti mosquitoes were obtained from the Liverpool strain, which was previously used to generate the reference genome [60]. These mosquitoes were raised in incubators at 30°C with 20–40% humidity and a 12-hour light/dark cycle in cages (Bugdorm, 24.5 x 24.5 x 24.5 cm). Adults were given 10% (m/V) aqueous sucrose ad libitum, and females were given a blood meal by feeding on anesthetized mice for approximately 15 minutes. Oviposition substrates were provided about 3 days after the blood meal. Eggs were collected, aged for about 4 days to allow for embryonic development, and then hatched in deionized water in a vacuum chamber. Approximately 400 larvae were reared in plastic containers (Sterilite, 34.6 x 21 x 12.4 cm, USA) with about 3 liters of deionized water and fed fish food (TetraMin Tropical Flakes, Tetra Werke, Melle, Germany). For genetic crosses, female virginity was ensured by separating and sexing the pupae under the microscope based on sex-specific morphological differences in the genital lobe shape (at the end of the pupal abdominal segments just below the paddles) before releasing them to eclose in cages. These general rearing procedures were followed unless otherwise noted. In order to increase the number of homozygotes in the 1174D transgenic line, we transferred both the high-intensity EGFP pupae and female EGFP-negative pupae to a cage and allowed them to mate after eclosion. Female mosquitoes were fed a blood meal, and five adult females were individually transferred to egg tubes for colonization and egg collection. The eggs from each colony were hatched and reared. The colonies with a higher proportion of female EGFP negatives and male EGFP positives were selected for colonization in the next generation. After a few rounds of colonization, the colonies with 100% of males in the strong EGFP positive group and 100% of females in the EGFP negative group were selected and propagated for expansion. All animals were handled in accordance with the Guide for the Care and Use of Laboratory Animals as recommended by the National Institutes of Health and approved by the University of California San Diego Institutional Animal Care and Use Committee (IACUC, Animal Use Protocol #S17187) and University of California San Diego Biological Use Authorization (BUA #R2401).

COPAS fluorescent sorting, sexing and imaging

To determine the precise number of larvae in COPAS clusters, the COPAS raw data was filtered based on the optical density and size measurements of the individuals, "log(EXT)" and "log(TOF)," to remove outliers such as egg debris and dust. Then, a filter was applied based on the individuals' fluorescence measurements, "log(first fluorescence)" and "log(second fluorescence)", to further refine the data. Finally, the fluorescence measurements were automatically clustered and denoised using Density-Based Spatial Clustering of Applications with Noise (DBSCAN) [66,67]. The analysis of COPAS data was conducted using the web-based app, Floreada.io (<https://floreada.io/>). COPAS sorting was performed largely as described for *Anopheles* larvae [47]. *Aedes* eggs stuck to their egg laying paper were briefly rinsed to eliminate dust and debris, immersed in deionized water in a small container, and their hatching was stimulated under partial vacuum (25% of atmospheric pressure) in a vacuum chamber for 30–60 minutes. They were then incubated overnight at 28°C to maximize larval hatching. On the next day, resulting unfed neonate larvae were transferred to the reservoir of a large particle flow cytometry COPAS SELECT instrument (Union Biometrica, Holliston, MA, USA) equipped with a multiline argon laser (488, 514 nm) and a diode laser (670 nm). Larvae were analyzed and sorted with the Biosort5281 software using a 488 nm filter and the following acquisition parameters: Green PMT 500, Red PMT 600, Delay 8; Width 6, pure mode with superdrops. Flow rate was kept between 20 and 70 objects per second through adjusting of the concentration of larvae in the sample. Larvae identified as males (EGFP positive) were

dispensed in a Petri dish. In these conditions, sorting speed ranged from 4000 to 7400 larvae in 10 minutes (+ 6 minutes for system initialization and 6 minutes for system cleaning and shut-down), the total number of sorted larvae being limited by the number of available larvae. Sorted larval counts provided by the COPAS software were recorded on sorting. For quality control of sorted larvae, the reservoir and fluidics of the instrument were carefully rinsed and the sorted larvae analyzed by passing them once more in the machine. In some experiments, objects falling outside the EGFP positive gate were collected in “Enrich” mode to remove EGFP negative contaminants from the pool of EGFP positive larvae, and verified by microscopy. Mosquitoes were examined, scored, and imaged using the Leica M165FC fluorescent stereomicroscope equipped with the Leica DMC2900 camera. For higher-resolution images, we used a Leica DM4B upright microscope equipped with a VIEW4K camera. To distinguish between male and female pupae in mosquitoes, we used a microscope to observe the sex-specific morphological differences in the genital lobe shape located at the end of the pupal abdominal segments just below the paddles. This allowed us to ensure that we were selecting both male and female pupae for our experiments.

Determination of genome integration sites

To determine the transgene insertion sites, we performed Oxford Nanopore genome DNA sequencing. We extracted genomic DNA using the Blood & Cell Culture DNA Midi Kit (Qiagen, Cat. No. / ID: 13343) from 5 adult males and 5 adult females of SEPARATOR, following the manufacturer’s protocol. The sequencing library was prepared using the Oxford Nanopore SQK-LSK110 genomic library kit and sequenced on a single MinION flowcell (R9.4.1) for 72 hrs. Basecalling was performed with ONT Guppy base calling software version 6.4.6 using dna_r9.4.1_450bps_sup model generating 3.03 million reads above the quality threshold of $Q \geq 10$ with N50 of 7941 bp and total yield of 11.08 Gb. To identify transgene insertion sites, nanopore reads were mapped to plasmids carrying SEPARATOR (1174D, Addgene as plasmid #200012) using minimap2 [68] and further aligned them to the AegL5.0 genome (GCF_002204515.2). Subsequently, we calculated the average depth of coverage for the three autosomes and the transgene using samtools and visualized the results in R. The coverage depths for chr1, chr2, and chr3 were determined to be 6.31, 6.30, and 6.08, respectively. Interestingly, the coverage depth for SEPARATOR transgene was notably higher at 16.14. Based on the coverage analysis, it appears that the SEPARATOR transgene is present in three copies (S3 Fig). By examining the read alignments using Interactive Genomics Viewer (IGV), we were able to determine the exact insertion sites. Notably, we identified three copies of the SEPARATOR constructs sequence. The three integration sites are NC_035109.1:92046983, NC_035108.1:444508475 and NC_035107.1:299022928. This finding aligns with the results of the depth of coverage analysis, further supporting the presence of three insertion sites. The second integration site on NC_035108.1 overlaps with the AAEL005024 gene, which is currently classified as an uncharacterized protein. However, the other two integration sites do not overlap with any known genes. The nanopore sequencing data has been deposited to the NCBI SRA (PRJNA985064).

RNA sequencing (RNA-seq) analysis

To quantify target gene reduction and expression from transgenes as well as to assess global expression patterns, we performed Illumina RNA sequencing. We extracted total RNA using miRNeasy Tissue/Cells Advanced Mini Kit (Qiagen, Cat. No. / ID: 217604) from 50 EGFP-positive male mosquitoes and 50 EGFP-negative female mosquitoes at L1 larva stage in biological triplicate (6 samples total), following the manufacturer’s protocol. Genomic DNA was

depleted using the gDNA eliminator column provided by the kit. RNA integrity was assessed using the RNA 6000 Pico Kit for Bioanalyzer (Agilent Technologies, Cat. No. / ID: #5067–1513), and mRNA was isolated from $\sim 1 \mu\text{g}$ of total RNA using NEBNext Poly(A) mRNA Magnetic Isolation Module (NEB, Cat. No. / ID: E7490). RNA-seq libraries were constructed using the NEBNext Ultra II RNA Library Prep Kit for Illumina (NEB, Cat. No. / ID: E7770) following the manufacturer's protocols. Briefly, mRNA was fragmented to an average size of 200 nt by incubating at 94°C for 15 min in the first strand buffer. cDNA was then synthesized using random primers and ProtoScript II Reverse Transcriptase followed by second strand synthesis using NEB Second Strand Synthesis Enzyme Mix. Resulting DNA fragments were end-repaired, dA tailed, and ligated to NEBNext hairpin adaptors (NEB, Cat. No. / ID: E7335). Following ligation, adaptors were converted to the "Y" shape by treating with USER enzyme, and DNA fragments were size selected using Agencourt AMPure XP beads (Beckman Coulter #A63880) to generate fragment sizes between 250–350 bp. Adaptor-ligated DNA was PCR amplified followed by AMPure XP bead clean up. Libraries were quantified using a Qubit dsDNA HS Kit (ThermoFisher Scientific, Cat. No. / ID: Q32854), and the size distribution was confirmed using a High Sensitivity DNA Kit for Bioanalyzer (Agilent Technologies, Cat. No. / ID: 5067–4626). Libraries were sequenced on an Illumina NextSeq2000 in paired end mode with the read length of 50 nt and sequencing depth of 25 million reads per library. Base calls and FASTQ generation were performed with DRAGEN 3.8.4. The reads were mapped to the AegL5.0 genome (GCF_002204515.2) supplemented with SEPARATOR transgene sequences using STAR. On average, $\sim 97.4\%$ of the reads were mapped. The analysis of RNA-Seq data was performed using an integrated web application called iDEP [69]. TPM values were calculated from counts produced by feature counts and combined (S4 Table). Hierarchical clustering of the data shows that for each genotype, all replicates cluster together, as expected (S5A and S5B Fig). DESeq2 was then used to perform differential expression analyses between male (EGFP-positive) and female (EGFP-negative) at L1 larvae stage (S5C Fig). For each DESeq2 comparison, gene ontology enrichments were performed on significantly differentially expressed genes. (S5D and S5E Fig and S5 Table). Illumina RNA sequencing data has been deposited to the NCBI-SRA (PRJNA985064). For transcriptome comparing analysis, we acquired 47 files consisting of six developmental stages (L3 larvae, L4 larvae, early pupae, mid pupae, late pupae, and adult carcass) from SRA (S6 Table). These files were then aligned to the AegL5 genome (GCF_002204515.2) using STAR. The analysis of RNA-Seq data was performed using an integrated web application called iDEP [69]. TPM values were calculated from counts produced by feature counts and combined (S8 Table).

Statistical analysis

Statistical analysis was performed in Prism9 for macOS by GraphPad Software, LLC. At least three biological replicates were used to generate statistical means for comparisons.

Supporting information

S1 Fig. Sex-specific RNA splicing of SEPARATOR. Fifty GFP-positive larvae and fifty GFP-negative larvae at the L1 stage were carefully sorted, and total RNA was extracted from each group. To determine the splicing patterns, RT-PCR was performed using specific primers targeting the 3' end of the Hr5Ie1 promoter sequence and the 5' end of the EGFP coding sequence. (A) The relative locations of the primer target sites are indicated by blue arrows. (B) The PCR products were subsequently purified and subjected to sequencing in order to validate the splicing junctions. The resulting splicing patterns are depicted in the right panel. (C) The relative levels of non-sex-specifically regulated exons (exon4 and exon6) and female-specific

exons (exon5a, exon5b) of SEPARATOR were determined through RNA sequencing (RNA-seq) analysis. The FPKM (fragments per kilobase per million mapped reads) values of each exon were normalized using the average FPKM of the non-sex-specifically regulated exons (exon4 and exon6). The bar plot displays the means and \pm SD (standard deviation) for triple biological replicates. Statistical significance of mean differences was assessed using a Tukey's multiple comparisons test, with p-values denoted as follows: $p < 0.01^{**}$ and $p < 0.0001^{****}$. Figure was created using BioRender.

(TIF)

S2 Fig. Sex-specific RNA splicing patterns verified through RNA sequencing analysis. The splicing patterns of SEPARATOR were verified through RNAseq analysis in both GFP-positive and GFP-negative mosquitoes, with triple biological replicates for each condition. The RNA-seq reads for the different genotypes were aligned, and the location of exons is indicated at the bottom in blue.

(TIF)

S3 Fig. The transgene copy number for SEPARATOR was determined using Oxford Nanopore genome sequencing. A standard box plot is used to illustrate the coverage distributions of three chromosomes (Chr1, Chr2 and Chr3) and the SEPARATOR transgenes (1174D) in SEPARATOR mosquitoes. The center line represents the median, while the first and third quartiles define the boundaries of the box. The upper and lower whiskers extend from the box to the highest and lowest observed values, respectively, but no further than 1.5 times the Interquartile Range (IQR) from the box. Based on the sequencing depths, the coverage for chromosomes 1, 2, and 3 were 6.31, 6.30, and 6.08, respectively, while the coverage for the SEPARATOR transgenes was 16.14. From the coverage analysis, it suggests that the SEPARATOR transgene (1174D) is present in three copies.

(TIF)

S4 Fig. Survival rate between wild-type (Liverpool) and SEPARATOR mosquitoes. Eggs from female mosquitoes of the wild-type (Liverpool) and SEPARATOR strains were individually collected and quantified. The hatched larvae were cultured, and their numbers were counted at the L3 and L4 larval, pupal, and adult stages.

(TIF)

S5 Fig. COPAS data processing. The COPAS raw data was initially filtered for the larvae using size and optical density criteria (Ext/Tof). Next, the particles that exhibited fluorescence (GFP/RFP) were gated. Subsequently, DBSCAN clustering was used to automatically cluster and denoise the data. Finally, the larvae that were GFP-positive were selected.

(TIF)

S6 Fig. Transcription profiling and expression analysis of GFP-positive and GFP-negative larvae at the L1 stage in SEPARATOR mosquitoes. (A) PCA analysis and (B) hierarchical clustering of six samples used for RNA sequencing. (C) MA-plots were generated to visualize the differential expression patterns between GFP-positive and GFP-negative larvae at the L1 stage in SEPARATOR mosquitoes. In the plot, significantly upregulated (male-enriched) genes ($FDR < 0.05$ and fold-change > 2) are indicated by red dots, significantly downregulated (female-enriched) genes ($FDR < 0.05$ and fold-change > 2) are indicated by blue dots, and non-significantly differentially expressed genes are represented by gray dots ($FDR > 0.05$ or fold-change < 2). Additionally, five well-known sex-enriched genes were marked in the plot. A network visualization was created to illustrate the relationship among enriched Gene

Ontology (GO) terms for the upregulated (D) and downregulated (E) genes.
(TIF)

S7 Fig. The RNA sequencing depth in SEPARATOR mosquitoes is greater than that observed in previous Matthews's RNA-seq datasets. In the transcriptome comparison analysis, we employed GFP-positive (Male, L1M) and GFP-negative (Female, L1F) larvae at the L1 stage from SEPARATOR mosquitoes. Additionally, we utilized larvae at the L3 (L3M and L3F) and L4 (L4M and L4F) stages, as well as early pupae (EPM and EPF), mid pupae (MPM and MPF), late pupae (LPM and LPF), and carcass of adult mosquitoes (CM and CF) from Matthews's RNA-seq datasets. The sequencing depth of the RNA-Seq data was achieved through the utilization of an integrated web application known as iDEP.
(TIF)

S8 Fig. Male-enriched genes from different developmental stages were identified in the transcriptome comparison analysis. In our transcriptome comparison analysis, we included L1 stage larvae from SEPARATOR mosquitoes. Furthermore, we incorporated L3 and L4 stage larvae, along with early pupae (EP), mid pupae (MP), late pupae (LP), and adult mosquito carcass (Adult) from Matthews's RNA-seq datasets. The correlation of male-enriched genes in this analysis was visualized using an UpSet plot, facilitated by the integrated web application iDEP.
(TIF)

S9 Fig. Female-enriched genes from different developmental stages were identified in the transcriptome comparison analysis. In our transcriptome comparison analysis, we included L1 stage larvae from SEPARATOR mosquitoes. Furthermore, we incorporated L3 and L4 stage larvae, along with early pupae (EP), mid pupae (MP), late pupae (LP), and adult mosquito carcass (Adult) from Matthews's RNA-seq datasets. The correlation of female-enriched genes in this analysis was visualized using an UpSet plot, facilitated by the integrated web application iDEP.
(TIF)

S10 Fig. Conducting a gene ontology (GO) analysis on sex-enriched genes throughout various developmental stages. In our transcriptome comparison analysis, we included L1 stage larvae from SEPARATOR mosquitoes. Furthermore, we incorporated early pupae (EP), mid pupae (MP), and late pupae (LP), from Matthews's RNA-seq datasets. The correlation of GO terms in sex-enriched genes within this analysis was identified and facilitated by the integrated web application iDEP.
(TIF)

S11 Fig. Gene expression analysis and clustering methods are used to identify and isolate a distinct set of genes associated with the larvae stage. Through mfuzz clustering analysis using comprehensive developmental stage data from a previous study, specific genes associated with either L1 or L2-L4 stages were identified. Notably, cluster 17 predominantly consisted of genes expressed in L1, while cluster 1 exhibited gene expression primarily in L2-L4 stages.
(TIF)

S1 Table. The sex sorting of SEPARATOR mosquitoes during the initial 15 generations.
(XLSX)

S2 Table. Summary of results from COPAS sorting experiments.
(XLSX)

S3 Table. FPKM of each exons in SEPARATOR mosquitoes.
(XLSX)

S4 Table. Combined annotations exons count.
(XLSX)

S5 Table. Enriched Gene Ontology (GO) terms for GFP-positive versus GFP-negative larvae in SEPARATOR mosquitoes.
(XLSX)

S6 Table. Library info_matthews.
(XLSX)

S7 Table. Read count_matthews.
(XLSX)

S8 Table. Read count_matthews.
(XLSX)

S9 Table. Upset Result-Male enriched.
(XLSX)

S10 Table. Upset Result-Female enriched.
(XLSX)

S11 Table. Upset Result-GO term.
(XLSX)

S12 Table. Akbari samples pruned.
(XLSX)

S13 Table. Akbari combined count.
(XLSX)

S14 Table. deseq2_1174D_pos_vs_neg.annotations.cluster_17.significantly_changed.
(XLSX)

S15 Table. deseq2_1174D_pos_vs_neg.annotations.cluster_1.significantly_changed.
(XLSX)

S16 Table. eseq2_1174D_pos_vs_neg.annotations.1st_instar_1tpm.significantly_changed.
(XLSX)

S17 Table. eseq2_1174D_pos_vs_neg.annotations.1st_instar_10tpm.significantly_changed.
(XLSX)

S18 Table. Sequences of primers and gBlock fragment used in this study.
(XLSX)

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