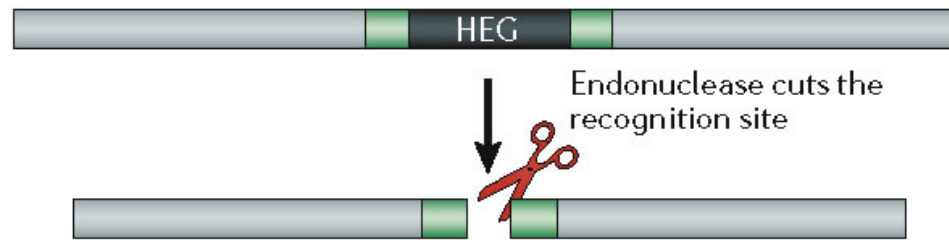
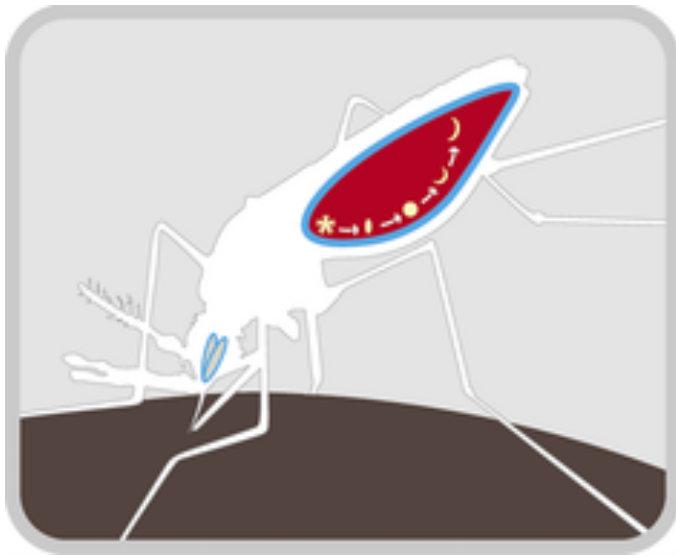
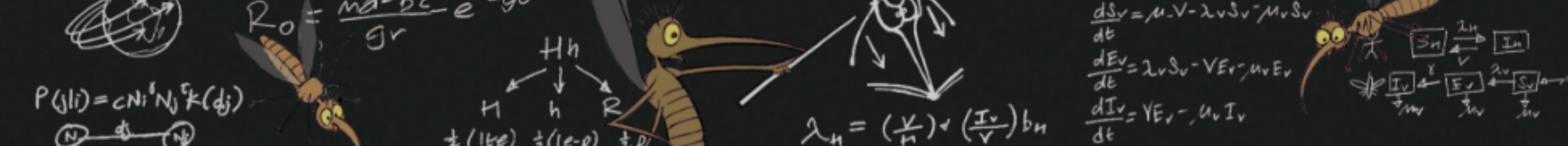


# Can malaria, dengue & Zika be controlled by a CRISPR-based gene drive?



John M. Marshall  
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Division of Biostatistics and Epidemiology  
University of California, Berkeley



**John Marshall**

**Samson Kiware**



**Héctor M. Sánchez C.**



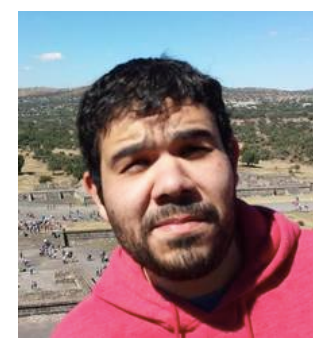
**Gordana Rašić**



**Yogita Sharma**



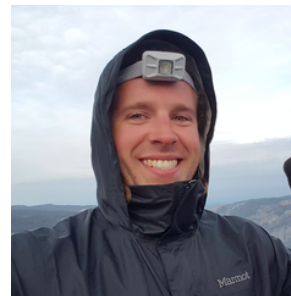
**Tomás León**



**Victor Ferman**



**Sean Wu**



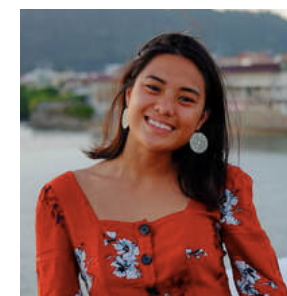
**Jared Bennett**



**Valeri Vasquez**



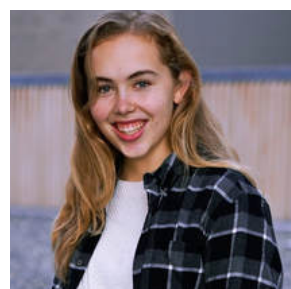
**Francois Rerolle**



**Thien-An Ha**



**Biyonka Liang**



**Sarafina Smith**

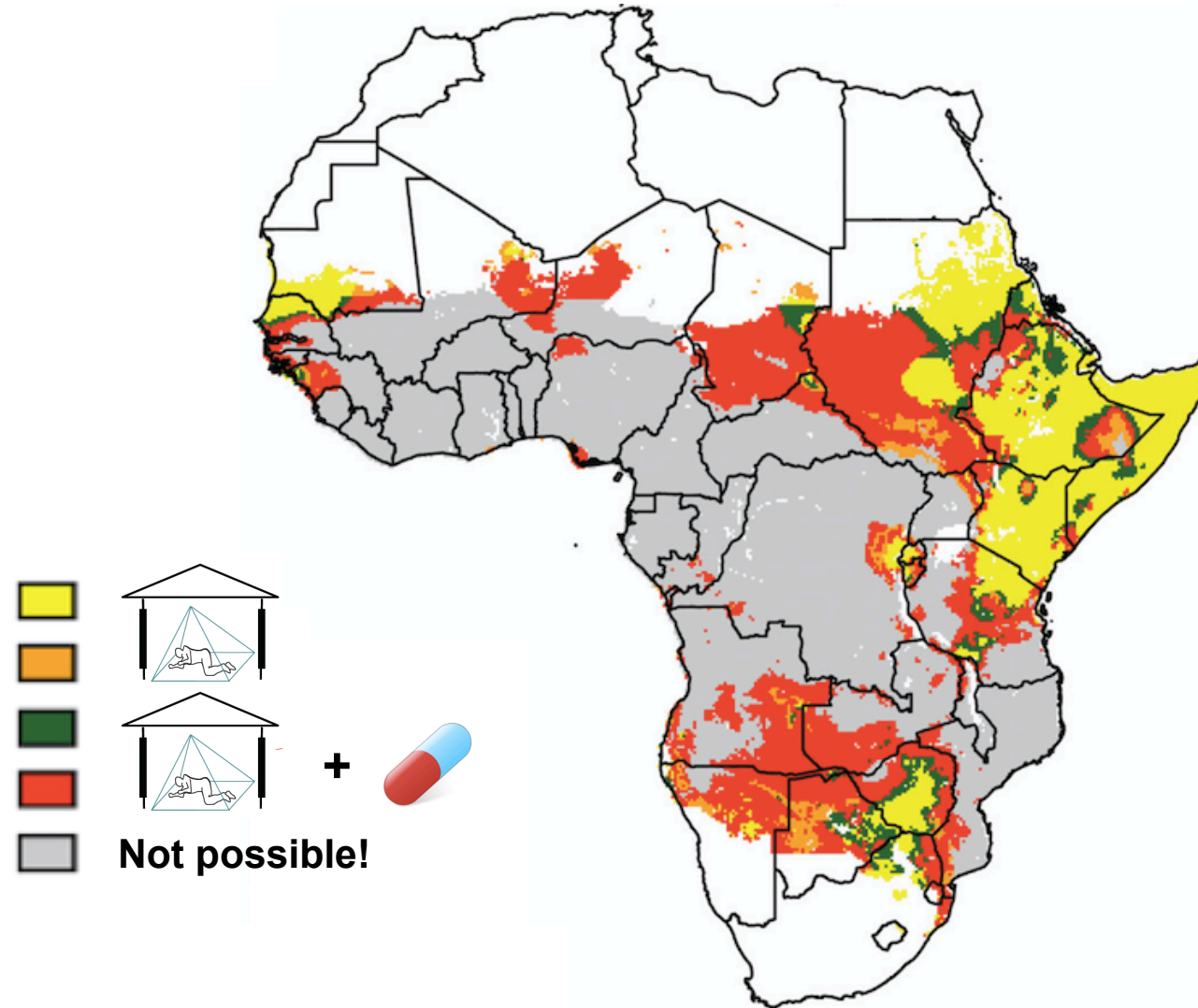


**Gillian Chu**



**Yi Li**

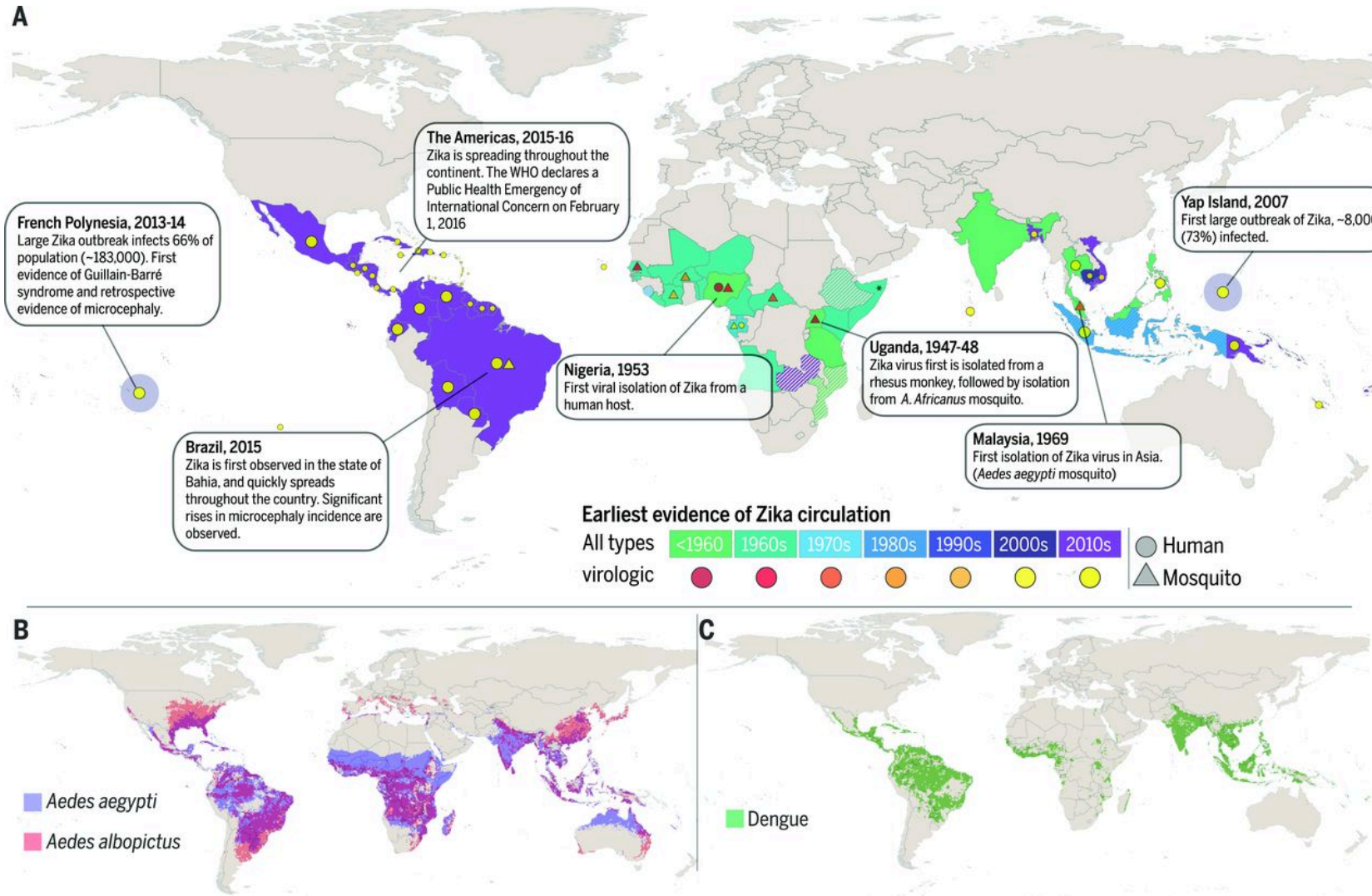
# Optimal interventions to eliminate malaria



- Walker PGT, Griffin JT, Ferguson NM, Ghani AC (2016) Lancet Global Health



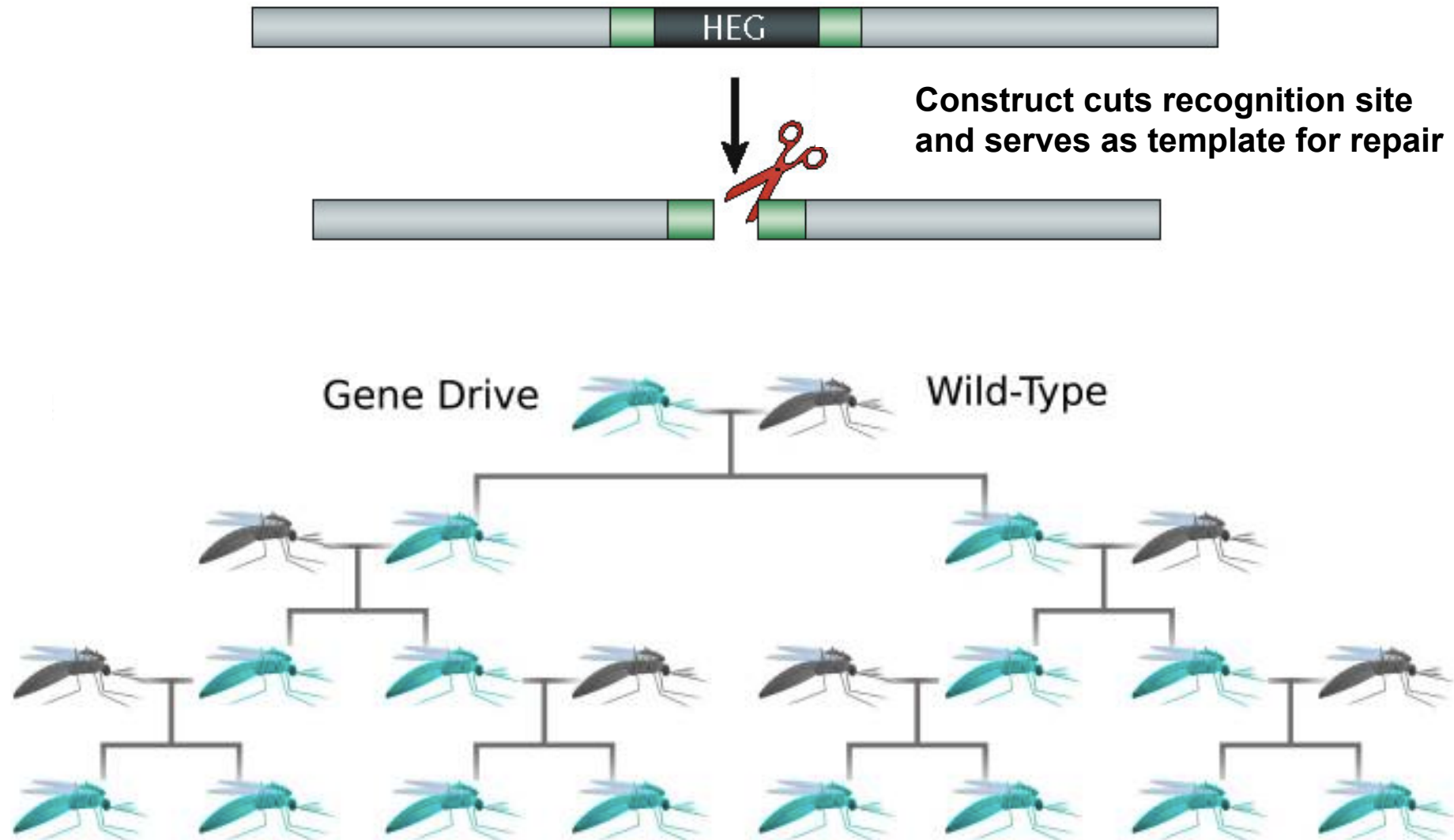
# Arboviruses are on the rise worldwide



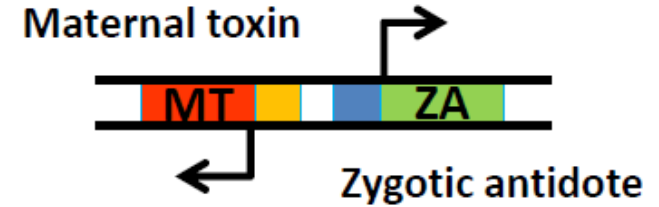
- Lessler J, Chaisson LH, Kucirka LM, Bi Q, Grantz K *et al.* (2016) Science 353: aaf8160



# Homing-based CRISPR-mediated gene drive



# Medea & toxin-antidote based gene drive



Transgenic mothers produce toxin

		Male				
		TT	Tt	Tt	tt	
Female	TT	TT <sub>1</sub>	TT <sub>2</sub>	Tt <sub>6</sub>	Tt <sub>5</sub>	
	Tt	TT <sub>3</sub>	TT <sub>4</sub>	Tt <sub>8</sub>	Tt <sub>7</sub>	
	tt	Tt <sub>11</sub>	Tt <sub>8</sub>	tt <sub>14</sub>	tt <sub>13</sub>	
		tt	Tt <sub>9</sub>	Tt <sub>10</sub>	tt <sub>12</sub>	tt

Transgenic offspring produce antidote

		Male				
		TT	Tt	Tt	tt	
Female	TT	TT <sub>1</sub>	TT <sub>2</sub>	Tt <sub>6</sub>	Tt <sub>5</sub>	
	Tt	TT <sub>3</sub>	TT <sub>4</sub>	Tt <sub>8</sub>	Tt <sub>7</sub>	
	tt	Tt <sub>11</sub>	Tt <sub>8</sub>	tt <sub>14</sub>	tt <sub>13</sub>	
		tt	Tt <sub>9</sub>	Tt <sub>10</sub>	tt <sub>12</sub>	tt

		Male				
		TT	Tt	Tt	tt	
Female	TT	TT <sub>1</sub>	TT <sub>2</sub>	Tt <sub>6</sub>	Tt <sub>5</sub>	
	Tt	TT <sub>3</sub>	TT <sub>4</sub>	Tt <sub>8</sub>	Tt <sub>7</sub>	
	tt	Tt <sub>11</sub>	Tt <sub>8</sub>	<del>tt<sub>14</sub></del>	<del>tt<sub>13</sub></del>	
		tt	Tt <sub>9</sub>	Tt <sub>10</sub>	tt <sub>12</sub>	tt

This causes the death of all offspring of heterozygous mothers that do not inherit the Medea allele (tt).

# Public attitudes to gene editing for malaria control in Mali



***“You have to start somewhere. From this, people will know whether it’s good or bad... I would like you to conduct a trial in my village because I would like to be an example for another community.”***

Elder, Koporo-na, Mali

***“I would have to see an example of modified mosquitoes reducing malaria in another village before I believe this claim”***

Elder, Tienfala, Mali

- Marshal JM, Toure MB, Traore MM, Famenini S, Taylor CE (2010) Malaria Journal 9: 128



# Can we conduct a confined field trial of gene-edited mosquitoes?

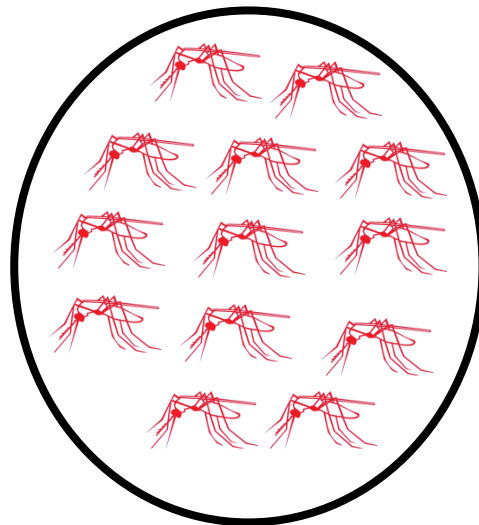


**Banambani, Mali**

7 km  
←→

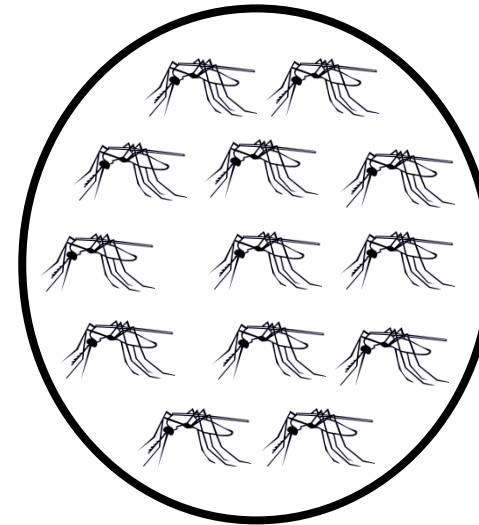


**Doneguebougou, Mali**



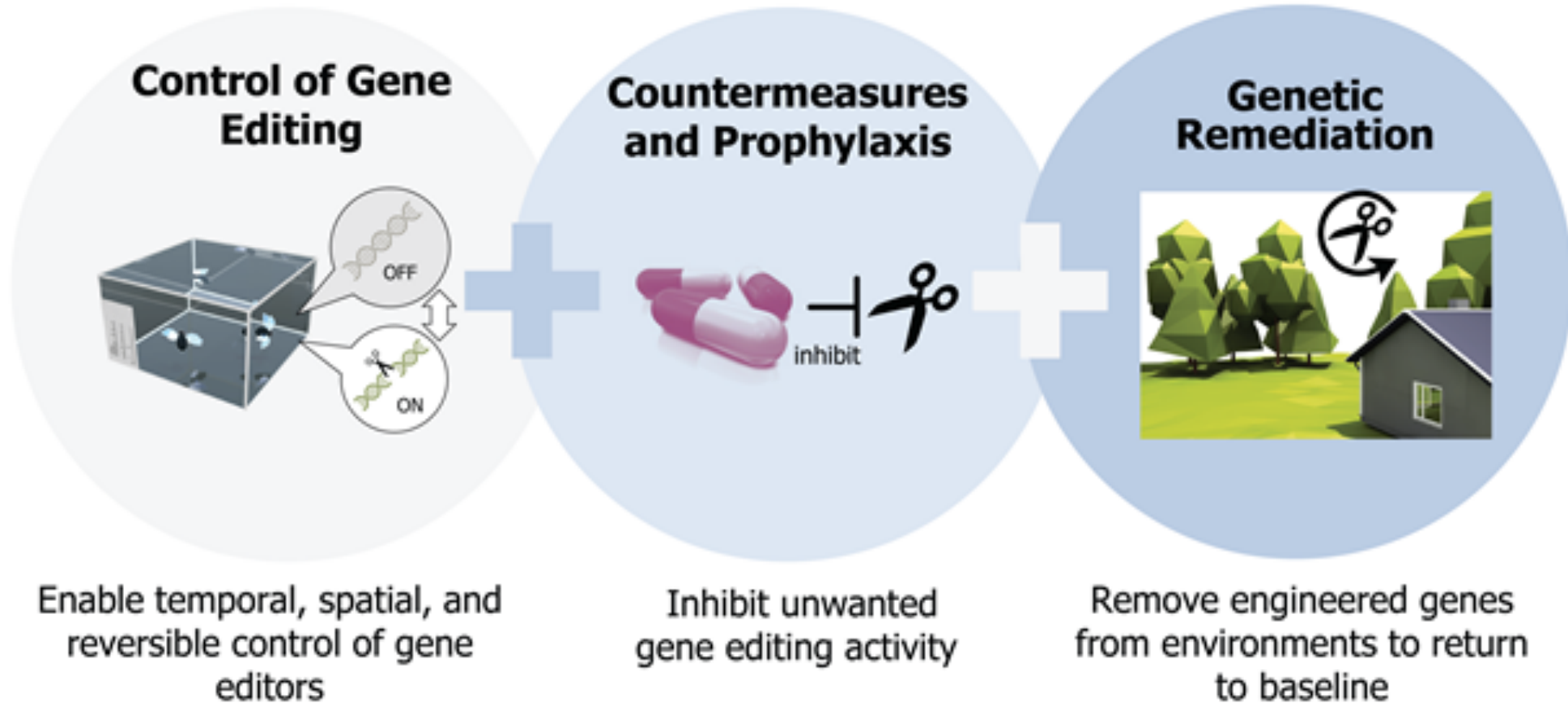
**Gene-edited mosquitoes**

←→



**Wild-type mosquitoes**

# DARPA Safe Genes Program



# UC Irvine Malaria Initiative



**UCI**  
MALARIA INITIATIVE

WHAT IS MALARIA?    WHAT IS POPULATION MODIFICATION? ▾    WHAT IS GENE-DRIVE? ▾    ABOUT ▾

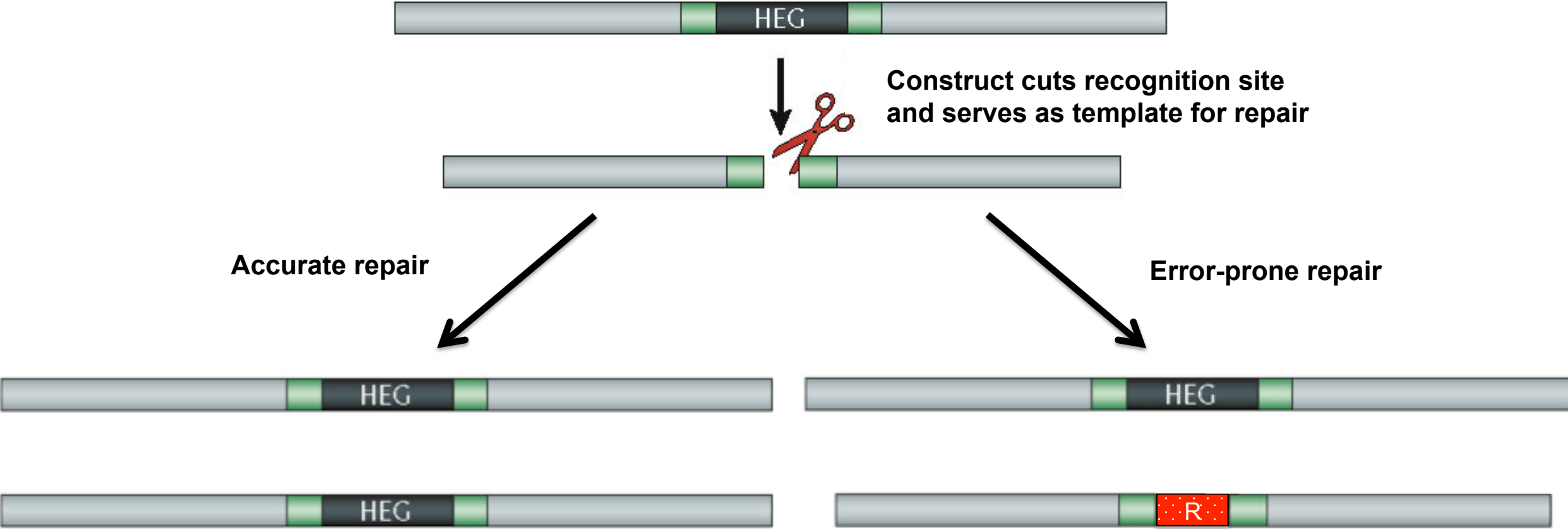
**OUR MISSION**

We're on the path to **end human malaria**



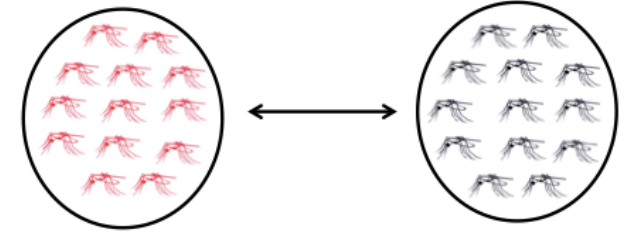


# Can CRISPR-based gene drive be effective at controlling disease on a wide scale?

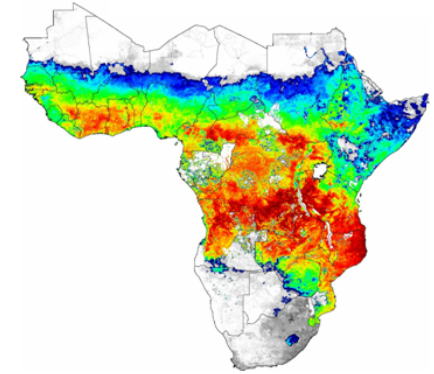


# Talk outline

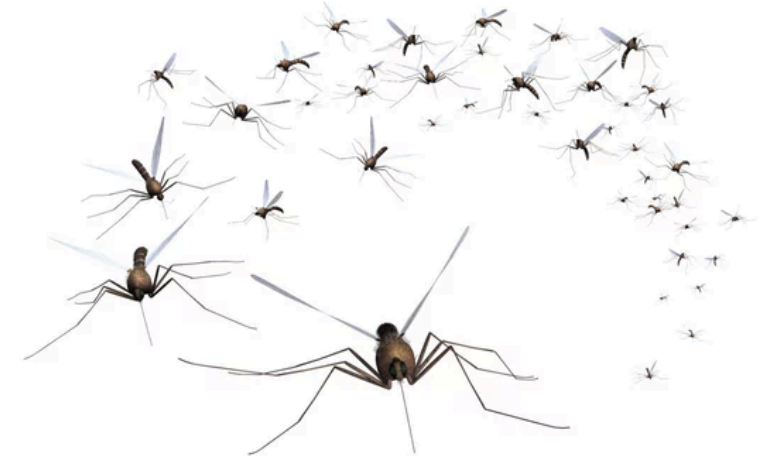
Q1. Can we conduct a confined field trial of gene-edited mosquitoes?



Q2. Can CRISPR-based gene drive be effective at controlling disease on a wide scale?



Q3. What are the best approaches for quantifying mosquito movement patterns of relevance to both questions?



# Q1. Can we conduct a confined field trial of gene-edited mosquitoes?

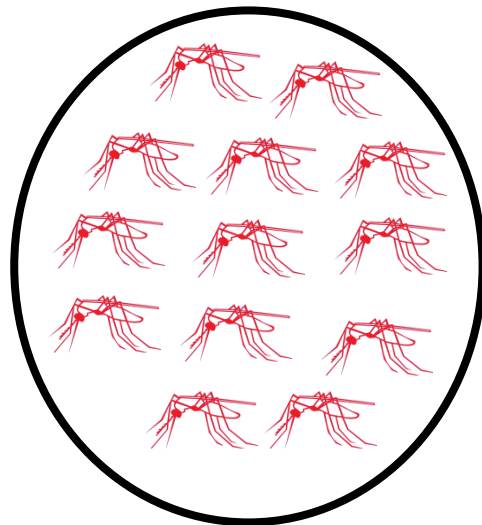


**Banambani, Mali**

7 km  
←→

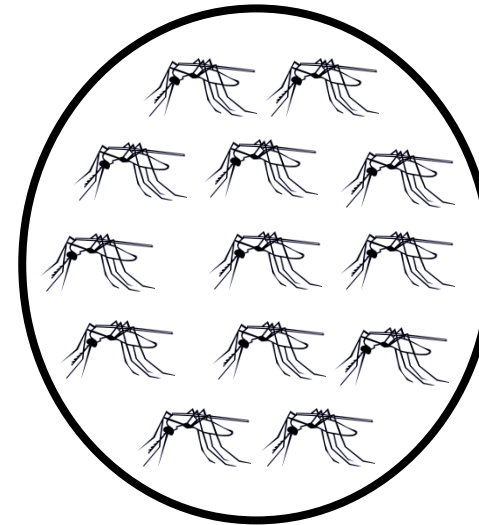


**Doneguebougou, Mali**



**Gene-edited mosquitoes**

←→



**Wild-type mosquitoes**



# Semele & threshold-dependent gene drive



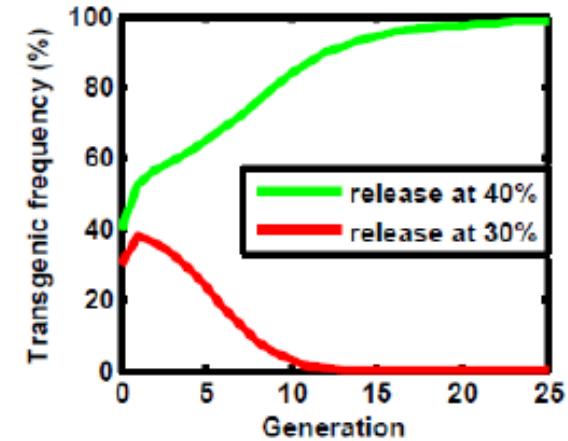
Transgenic males produce **toxic semen**

		Male			
		$TT$	$Tt$	$Tt$	$tt$
Female	$TT$	$TT_1$	$TT_2$	$Tt_6$	$Tt_5$
	$Tt$	$TT_3$	$TT_4$	$Tt_8$	$Tt_7$
	$tt$	$Tt_{11}$	$Tt_8$	$tt_{14}$	$tt_{13}$

Transgenic females produce **antidote**

		Male			
		$TT$	$Tt$	$Tt$	$tt$
Female	$TT$	$TT_1$	$TT_2$	$Tt_6$	$Tt_5$
	$Tt$	$TT_3$	$TT_4$	$Tt_8$	$Tt_7$
	$tt$	$Tt_{11}$	$Tt_8$	$tt_{14}$	$tt_{13}$

		Male			
		$TT$	$Tt$	$Tt$	$tt$
Female	$TT$	$TT_1$	$TT_2$	$Tt_6$	$Tt_5$
	$Tt$	$TT_3$	$TT_4$	$Tt_8$	$Tt_7$
	$tt$	$Tt_{11}$	$Tt_8$	$tt_{14}$	$tt_{13}$



This causes crosses between **transgenic males** and **wild females** to produce **no viable offspring**.

- Marshall JM, Pittman GW, Buchman A, Hay BA (2011) Genetics 187: 535-551.





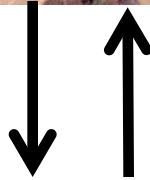


# Releases of *Semele* are confineable and reversible

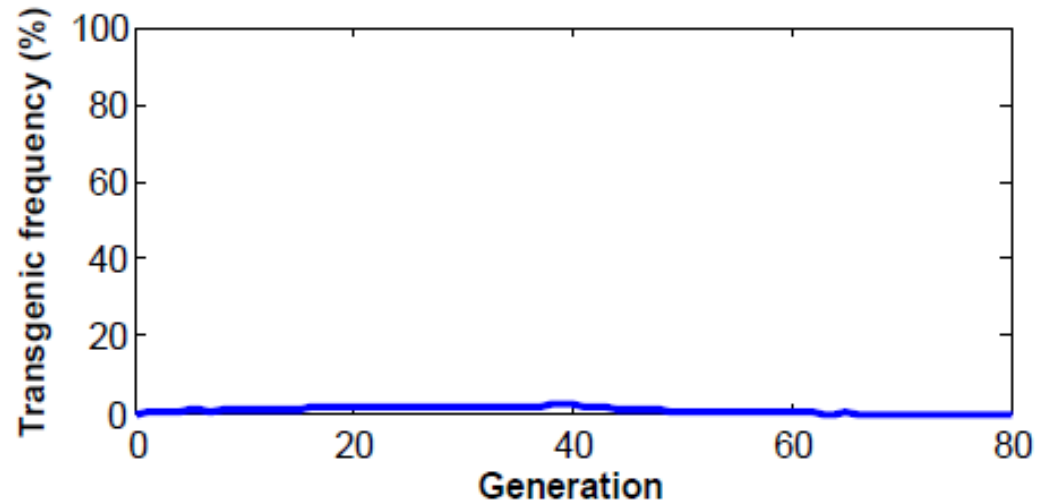
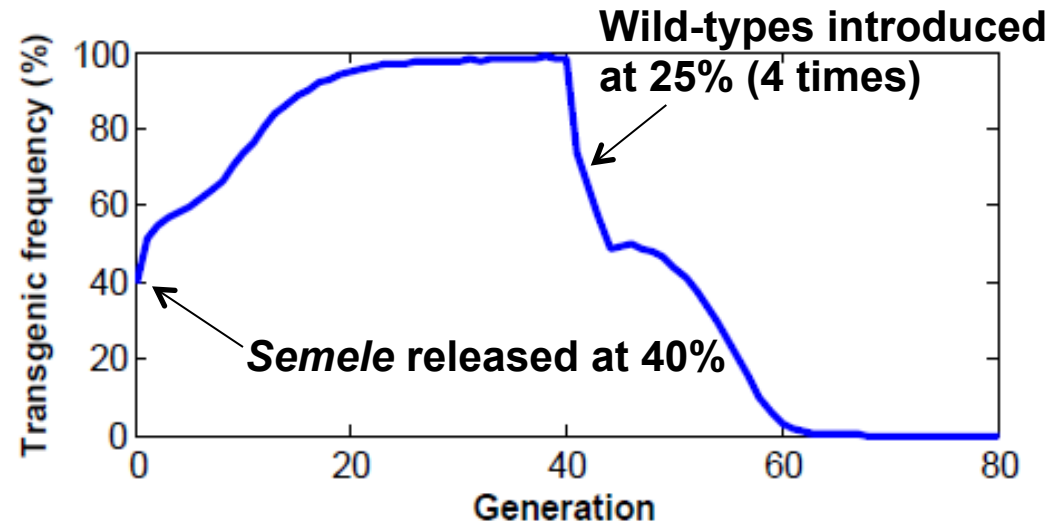
**Banambani, Mali**



Migration rate =  
~1% / generation



**Doneguebougou, Mali**

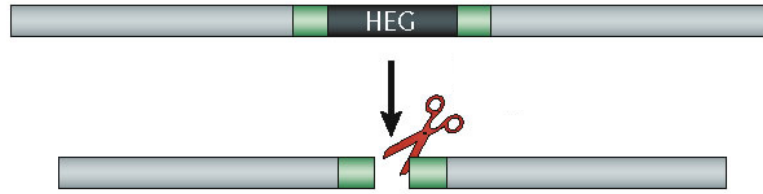


- Marshall JM, Pittman GW, Buchman A, Hay BA (2011) Genetics 187: 535-551.

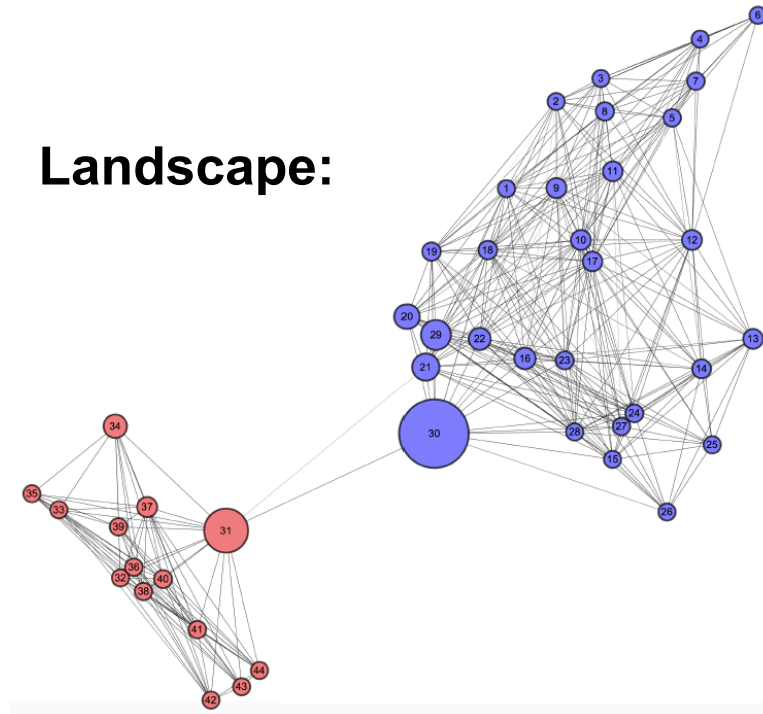


# Integrated spatially-explicit, ecological model

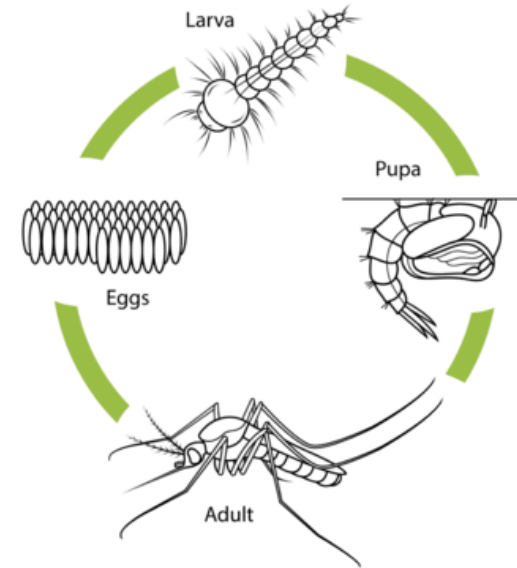
## Inheritance pattern:



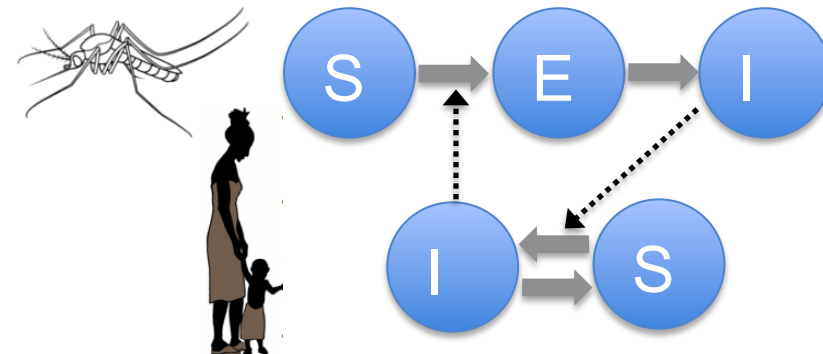
## Landscape:



## Mosquito life cycle:



## Disease epidemiology:



# Mosquito Gene Drive Explorer (MGDrivE)

## MGDrivE

Mosquitos + Tensors +  
Genetics + CS + Networks +  
Math + Coffee

View  
Releases List

Browse  
Documentation

View on  
Youtube

Fork on  
GitHub

Download  
ZIP File

Download  
TAR Ball

Developed in [John Marshall's Lab](#) by:

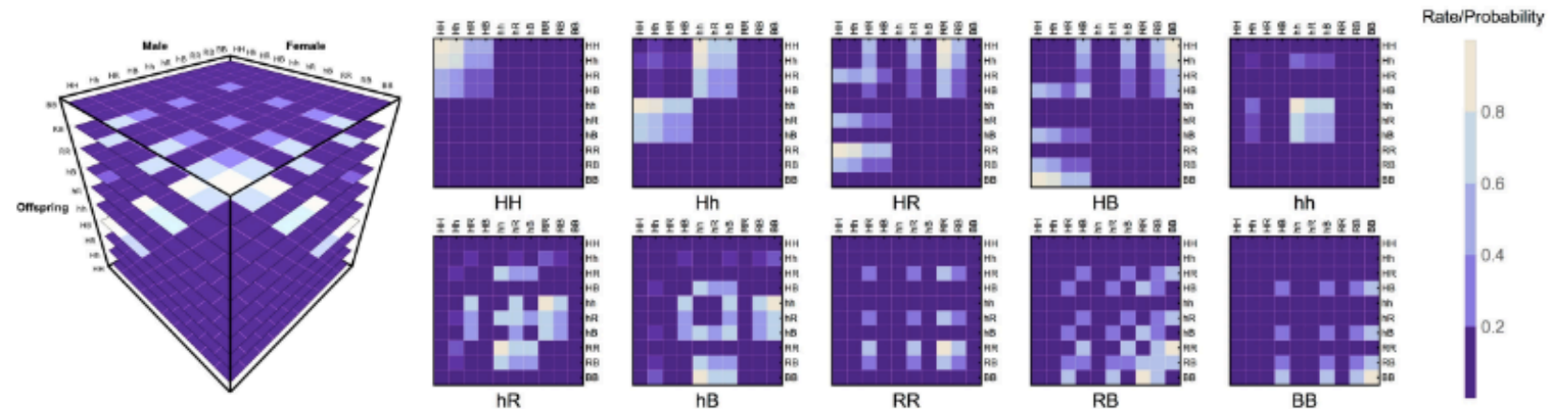
-Lead: [Héctor M. Sánchez C.](#)  
-Core Dev: [Sean L. Wu](#), [Jared Bennett](#)  
-Spatial Analysis: [Biyonka Liang](#), [Sarafina Smith](#),  
[Sabrina Wong](#)  
-Movement Kernels: [Partow Imani](#)

...and, of course, our PI: [John M. Marshall](#)

# Mosquito Gene Drive Explorer

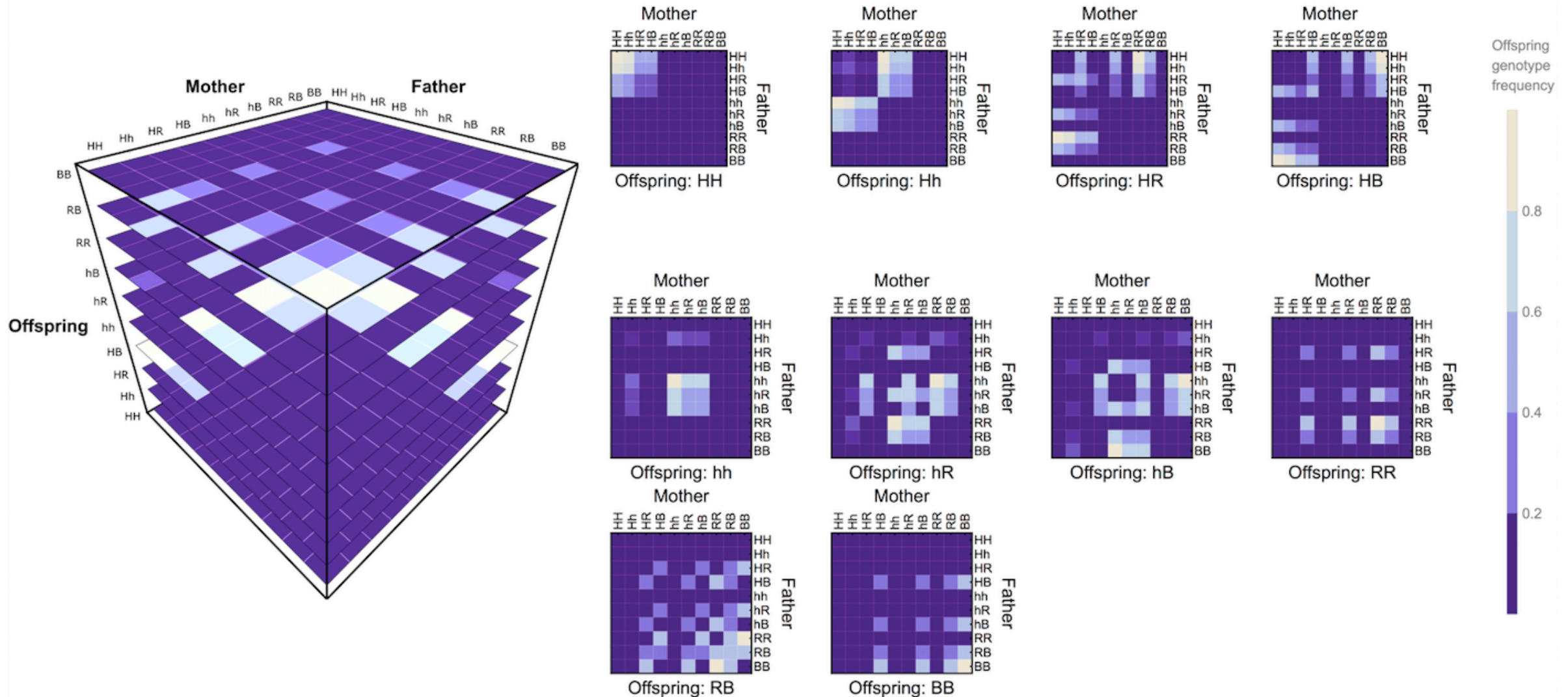
## Brief Description

**MGDrivE** is a framework designed to serve as a testbed in which gene-drive releases for mosquito-borne diseases control can be tested. It is being developed to accommodate various mosquito-specific gene drive systems within a population dynamics model that allows migration of individuals between nodes in a spatial landscape.



- Sánchez HM, Wu SL, Bennett JB, Marshall JM (2018) bioRxiv doi: <http://dx.doi.org/10.1101/350488>

# MGDrivE: Inheritance module



- Sánchez HM, Wu SL, Bennett JB, Marshall JM (2018) bioRxiv doi: <http://dx.doi.org/10.1101/350488>

# Mathematics of inheritance module

- The number of eggs having genotype  $i$  that are laid at time  $t$ ,  $E_{i,[t]}$ , is given by:

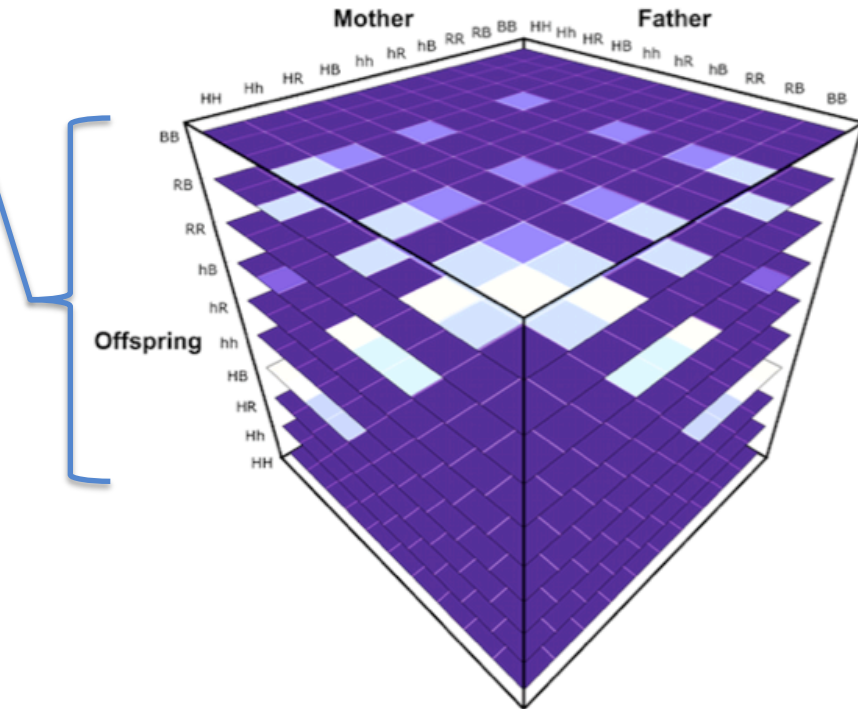
$$E_{i,[t]} = \overline{1_{1 \times n}} \times \left( \beta \cdot (\overline{s_{n \times 1}} \otimes \overline{1_{n \times 1}}) \circ \overline{F_{[t]}} \circ \overline{Ih(, , i)} \circ \overline{\Lambda(, , i)} \right) \times \overline{1_{n \times 1}}$$

$\beta$  = number of eggs produced per day  
 $s_i$  = female genotype-specific multiplier

$$\overline{M} = \begin{pmatrix} M_1 \\ M_2 \\ M_3 \\ \vdots \\ M_g \end{pmatrix} \quad \overline{F} = \begin{pmatrix} F_{11} & F_{12} & F_{13} & \cdots & F_{1g} \\ F_{21} & F_{22} & F_{23} & \cdots & F_{2g} \\ F_{31} & F_{32} & F_{33} & \cdots & F_{3g} \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ F_{g1} & F_{g2} & F_{g3} & \cdots & F_{gg} \end{pmatrix}$$

Number of adult males having each genotype,  $M_i$

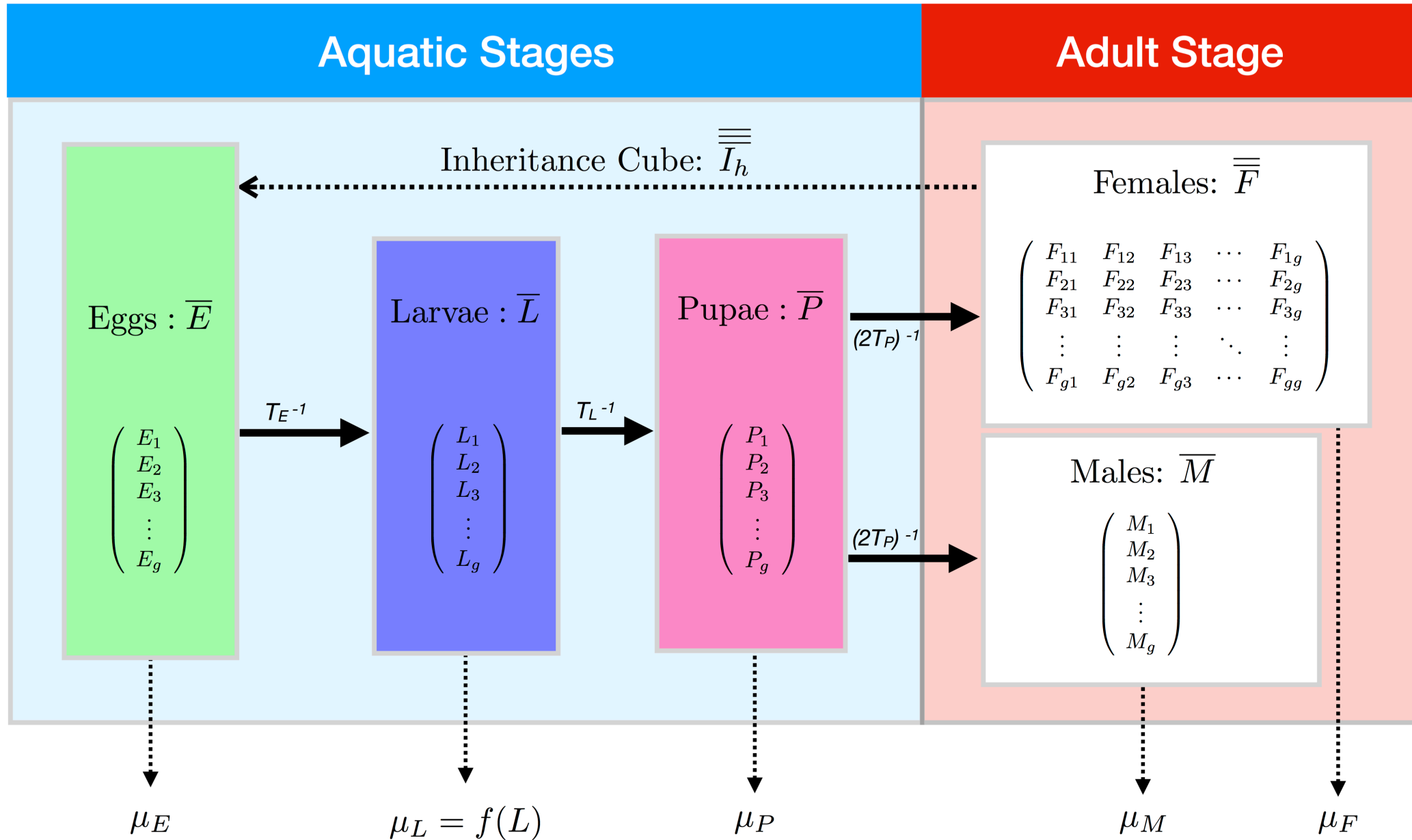
Number of adult females having each mated genotype,  $F_{ij}$ ,  $i$  = own genotype,  $j$  = genotype of father



For each pairing, the vertical columns represent the proportion of offspring having each genotype



# MGDrivE: Ecology module



# Mosquito vector species of interest



*Aedes aegypti*



*Anopheles gambiae*

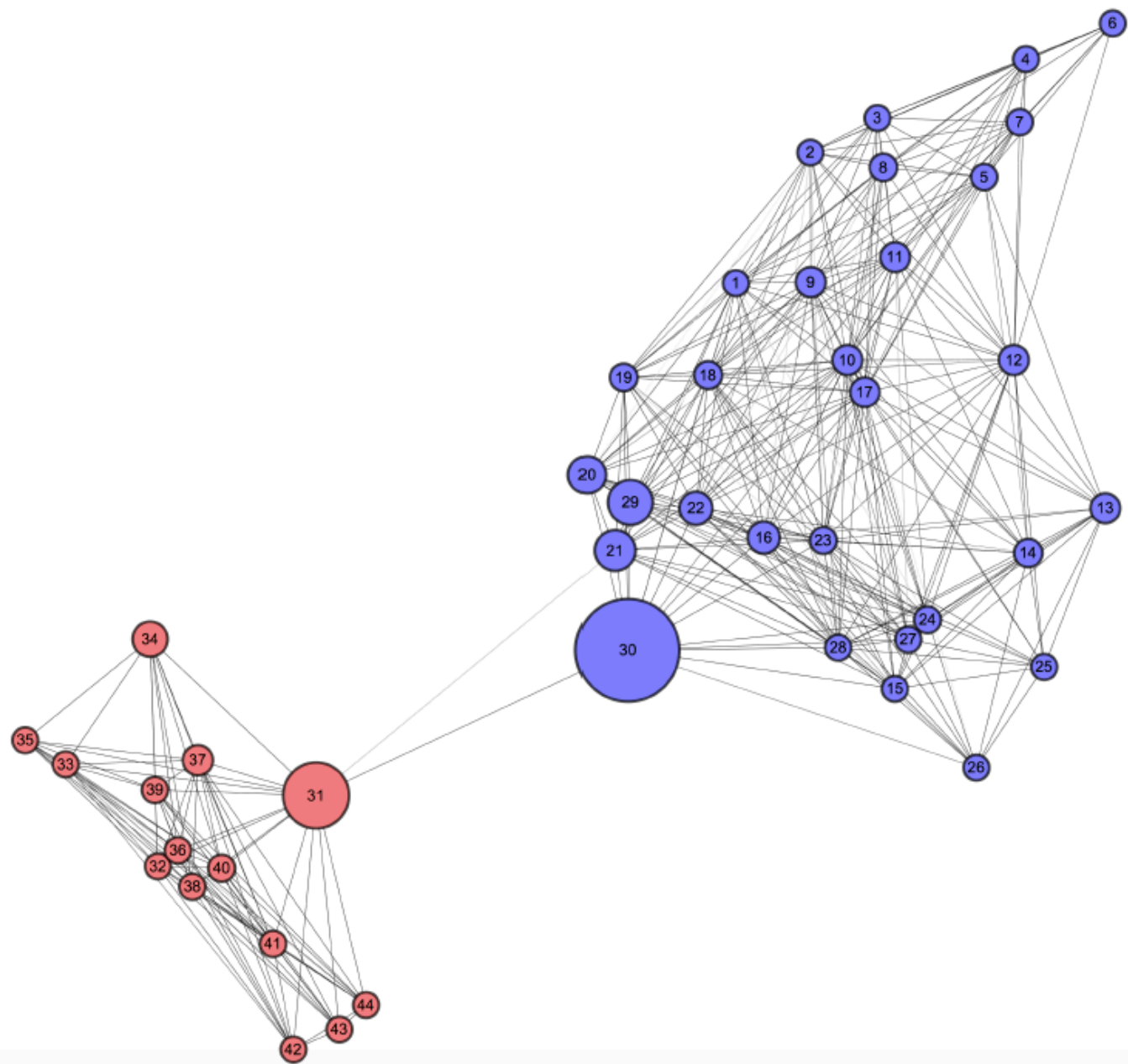


*Anopheles stephensi*

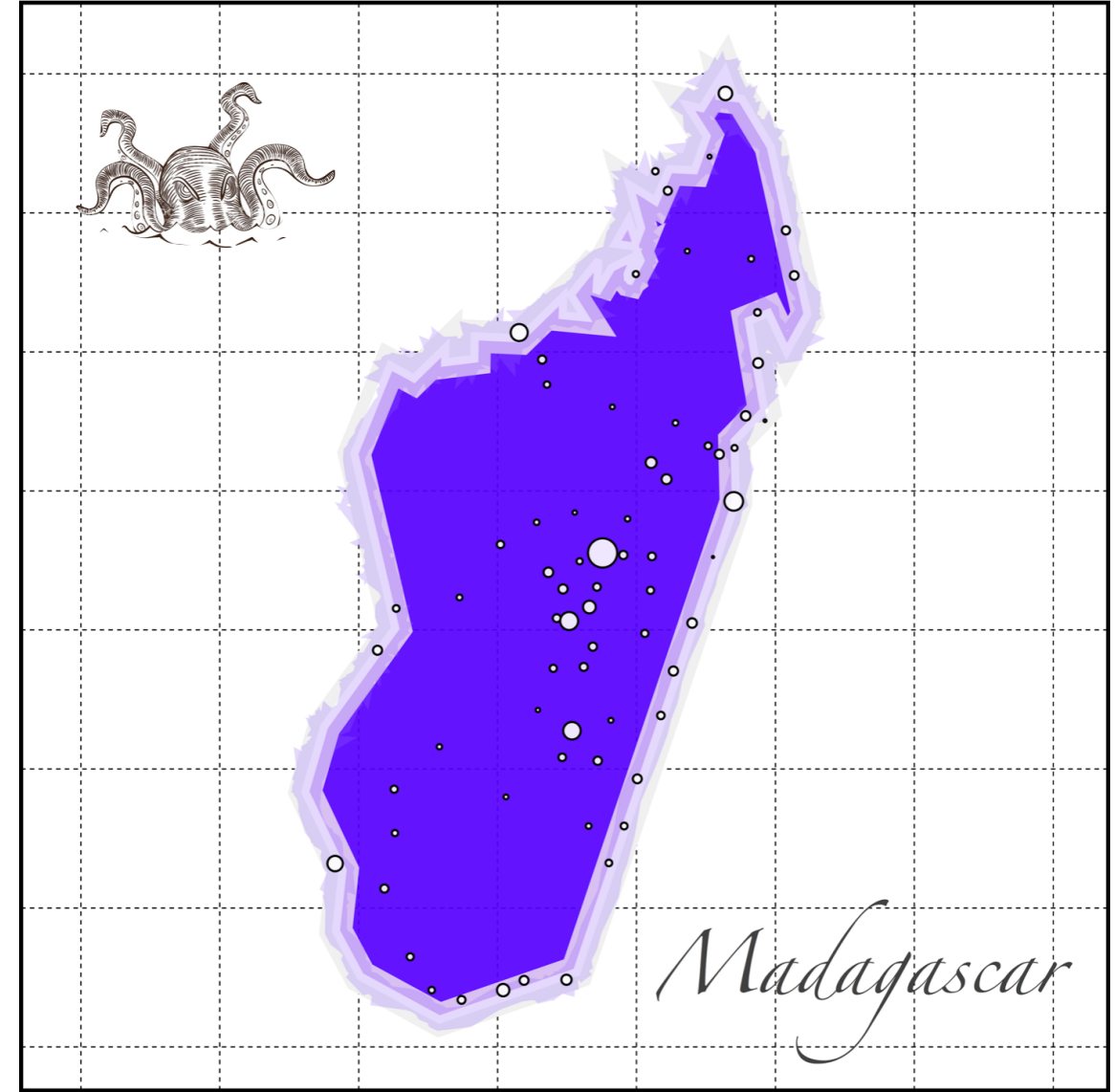
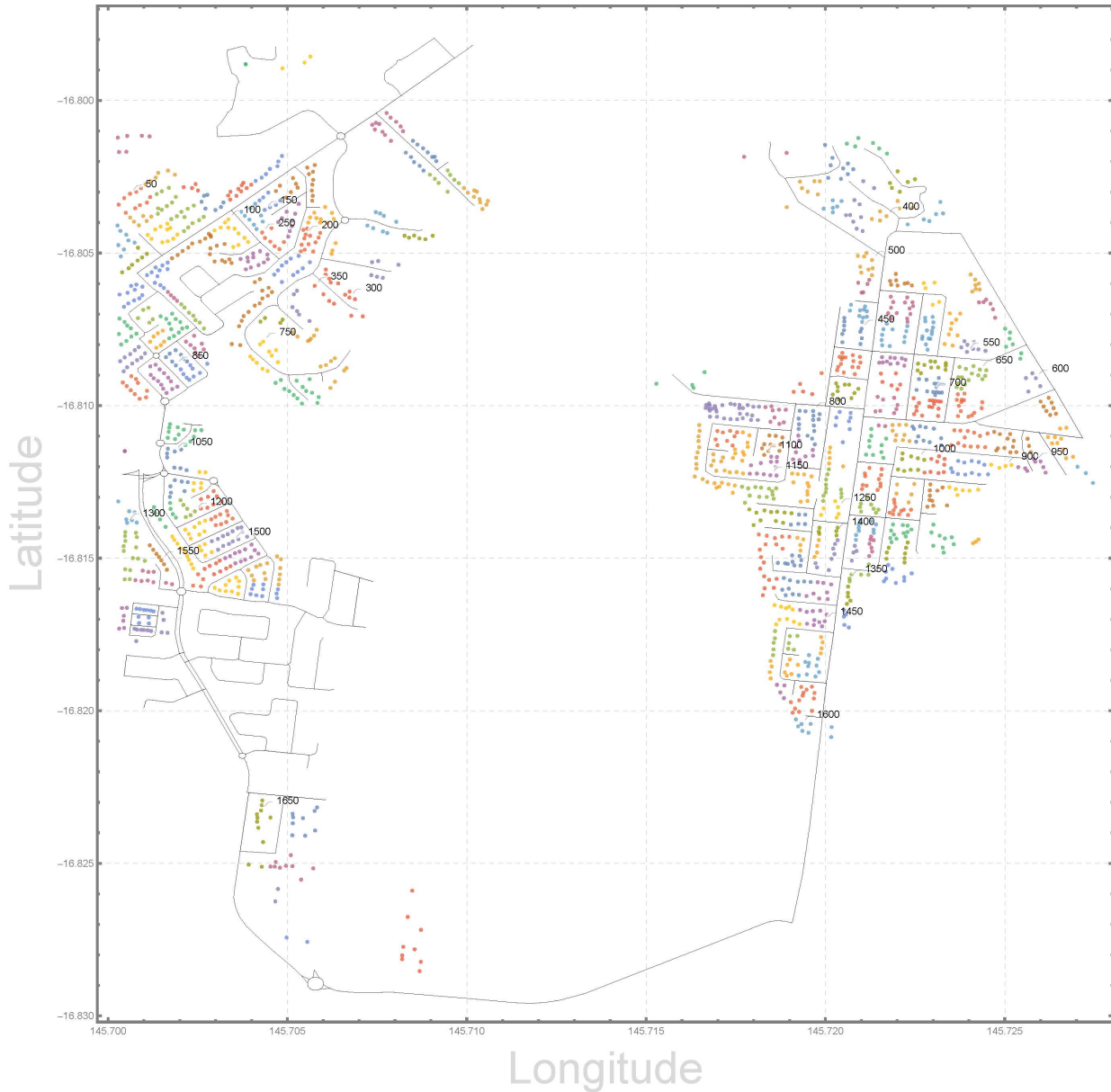
Parameter	Symbol	<i>Ae. aegypti</i>	<i>An. gambiae</i>	<i>C. capitata</i>
Egg production per female (day <sup>-1</sup> )	$\beta$	20 [36]	32 [37]	20 [38]
Duration of egg stage (days)	$T_E$	5 [39]	1 [37]	2 [38]
Duration of larval stage (days)	$T_L$	6 [39]	13 [37]	6 [38]
Duration of pupa stage (days)	$T_P$	4 [39]	1 [37]	10 [38]
Daily population growth rate (day <sup>-1</sup> )	$r_M$	1.175 [40]	1.096 [41]	1.031 [42]
Daily mortality risk of adult stage (day <sup>-1</sup> )	$\mu_M, \mu_F$	0.090 [43-45]	0.123 [41]	0.100 [46]

Table 2. Life history module parameter values for three species of interest (at a temperature of 25 Celsius).

# MGDrivE: Landscape module

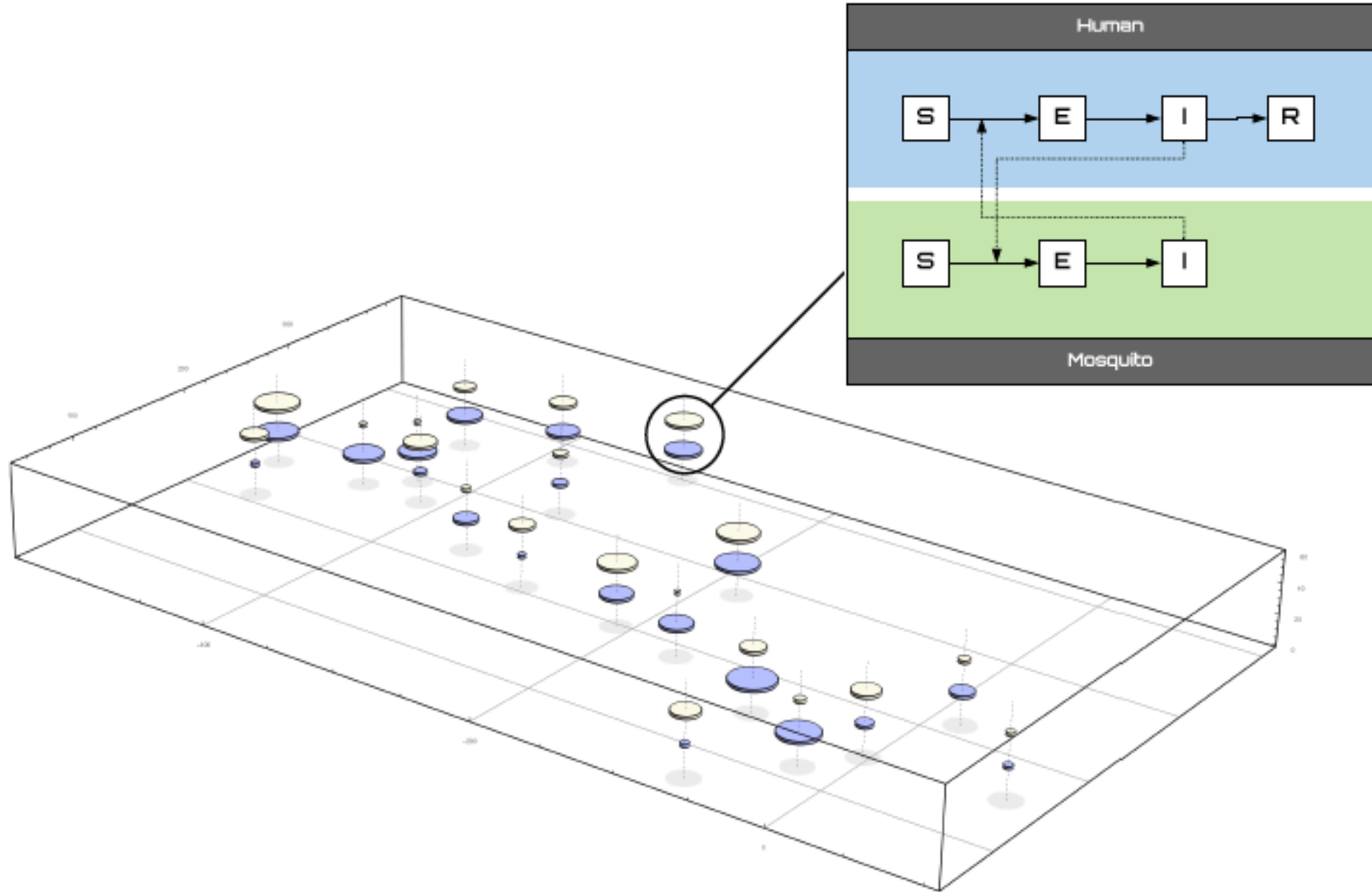


# Landscapes of interest for mosquito vectors

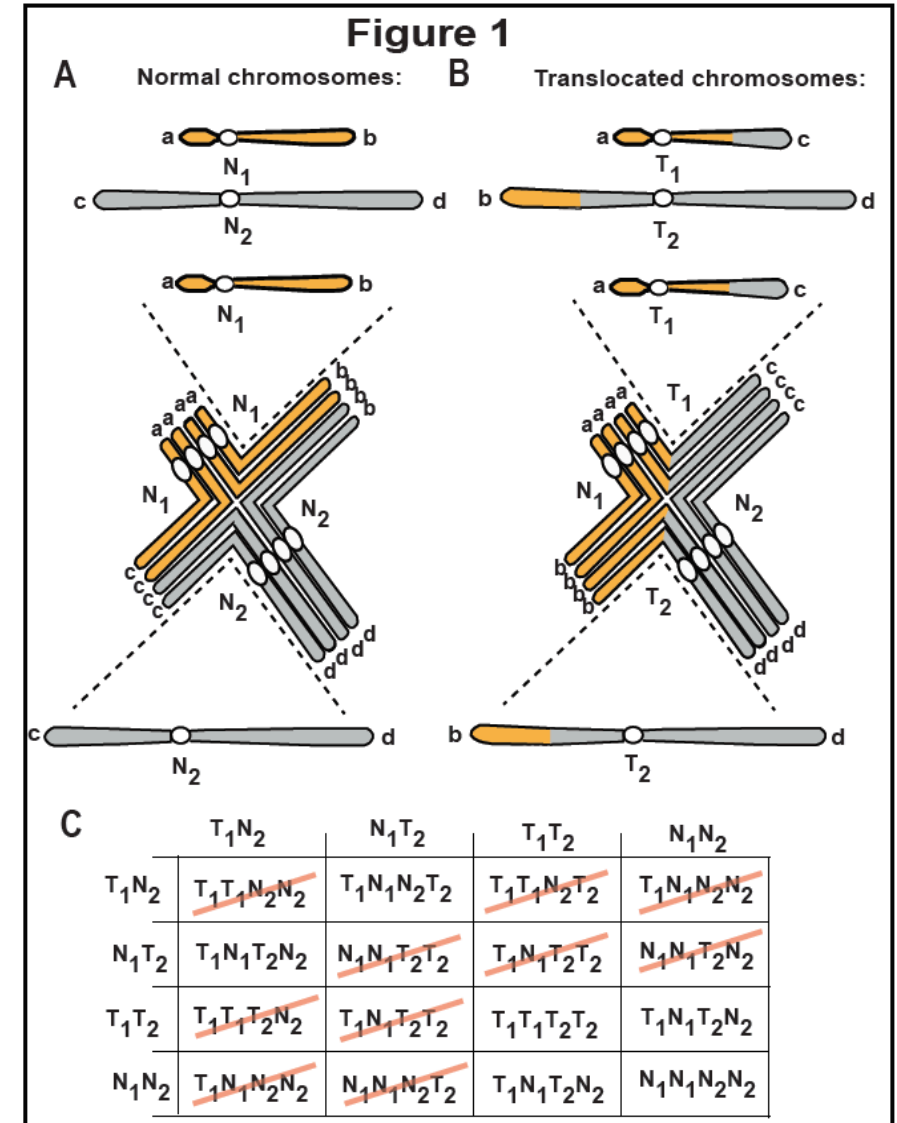
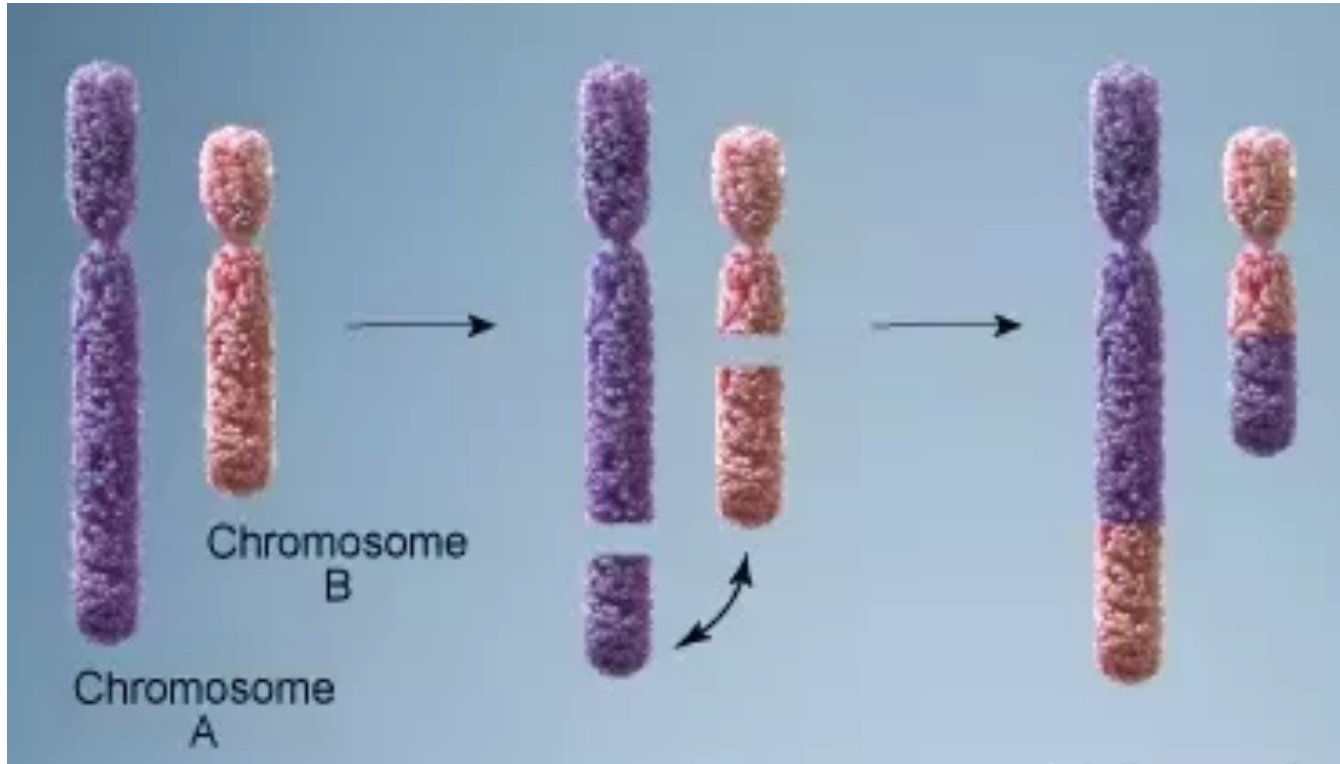




# Epidemiological extension for mosquito-borne diseases

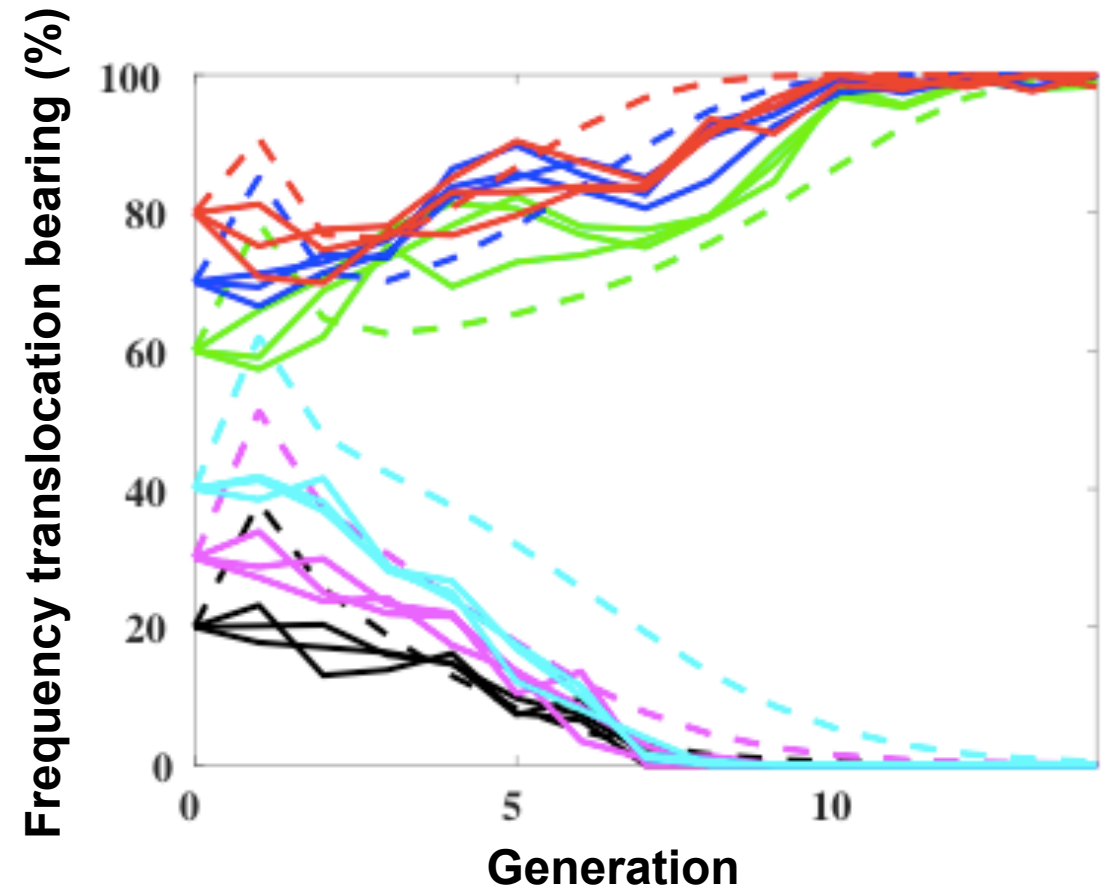
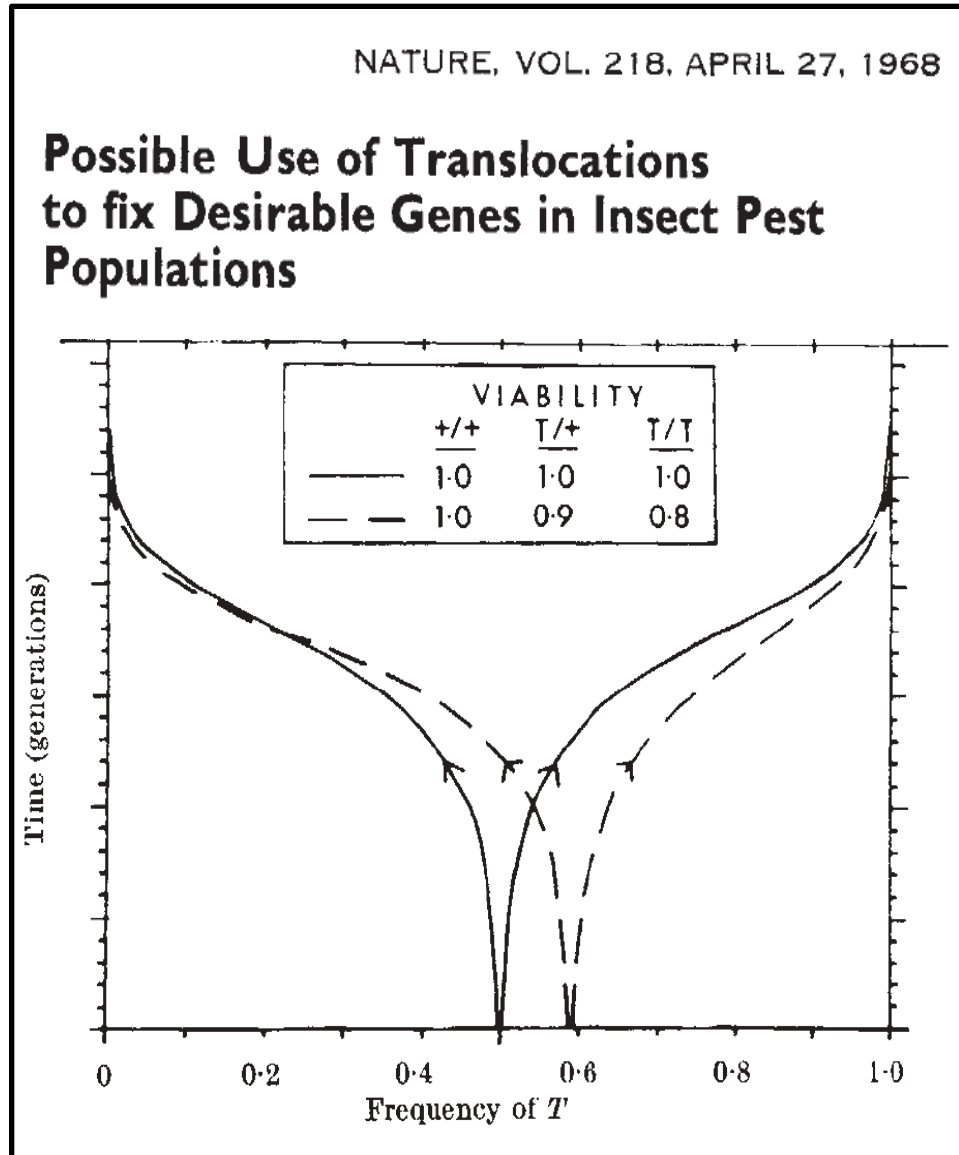


# Application: Chromosomal translocations



- Buchman A, Ivy T, Marshall JM, Akbari OS, Hay BA (2018) ACS Synthetic Biology

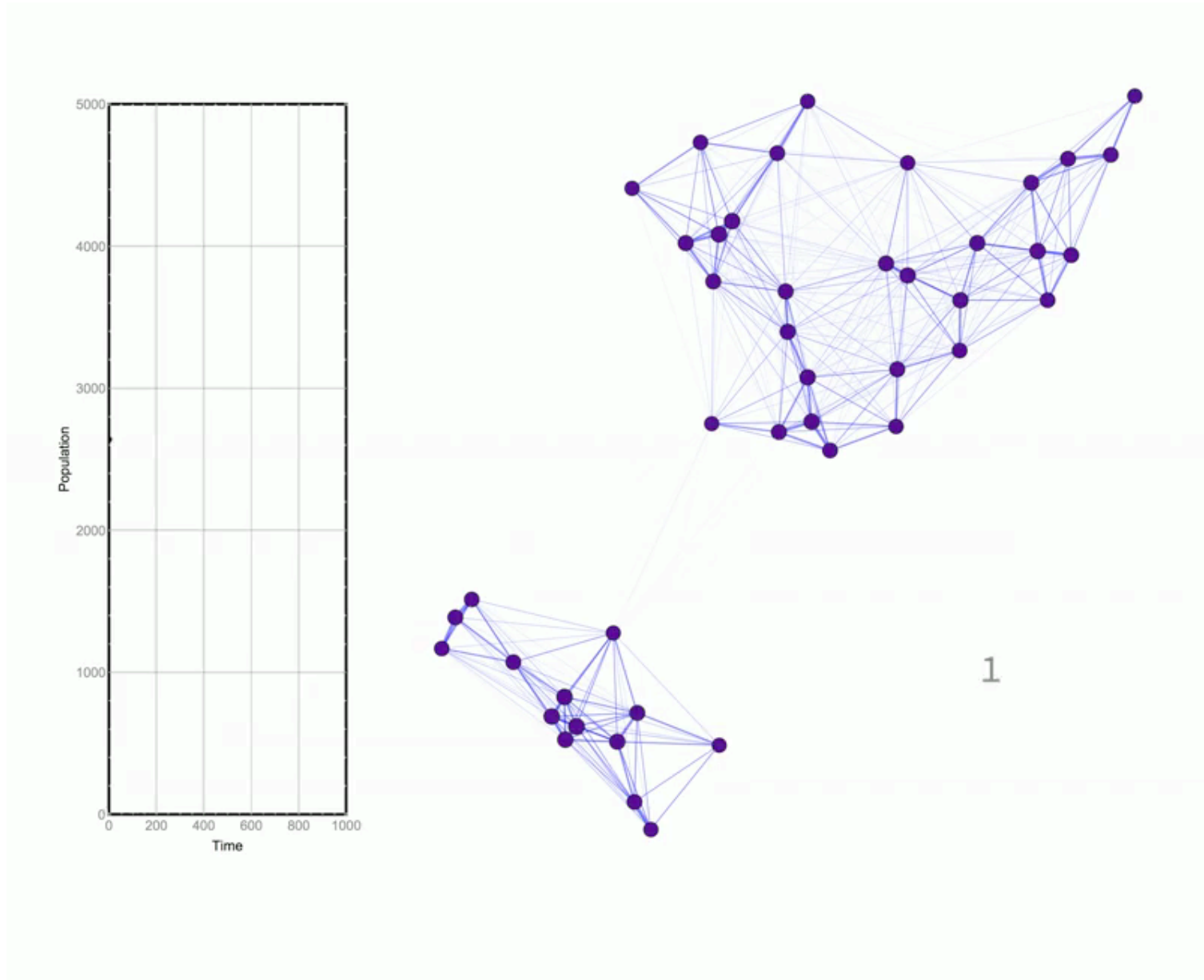
# Application: Chromosomal translocations



• Curtis CF (1968) Nature 218: 368-369

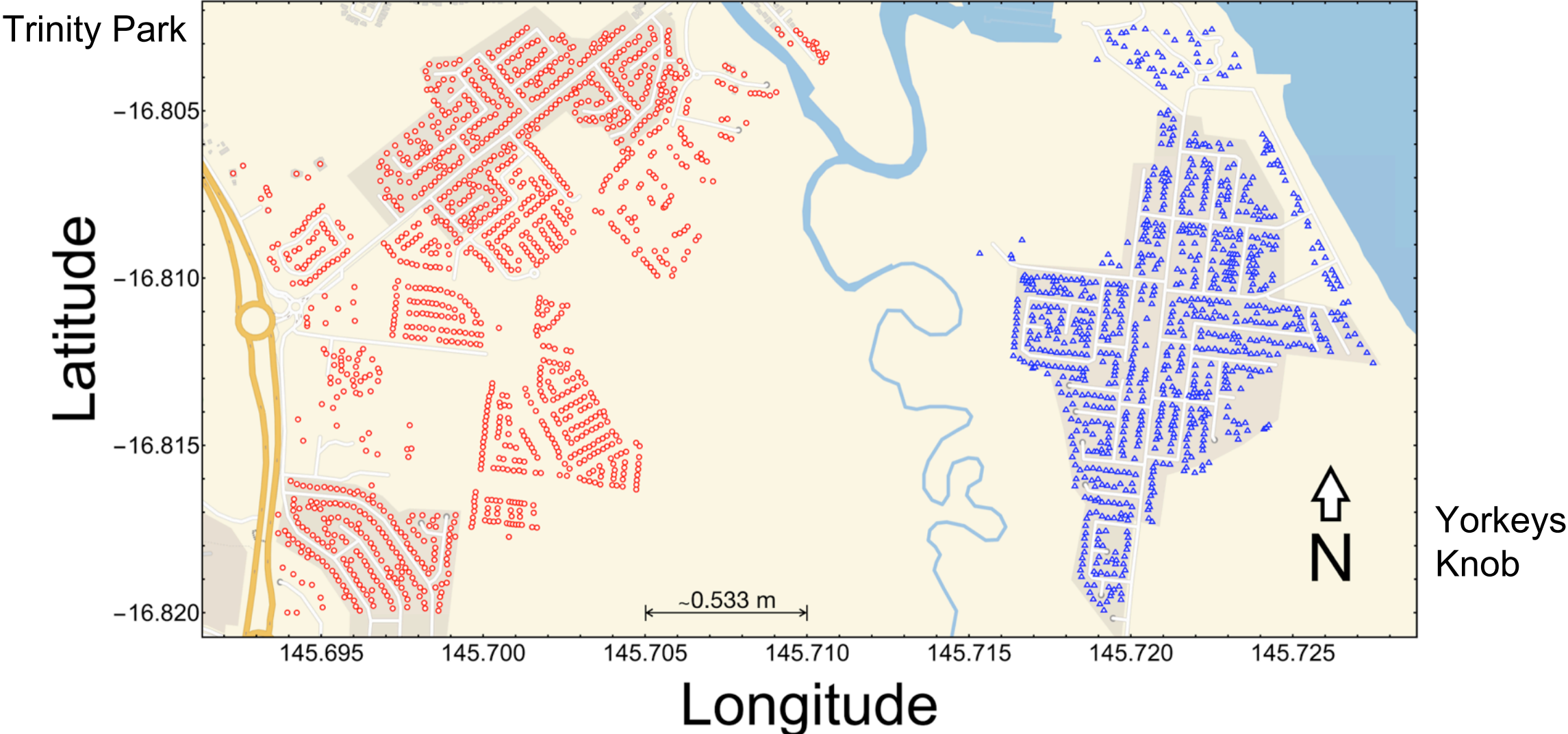
• Buchman A, Ivy T, Marshall JM, Akbari OS, Hay BA (2018) ACS Synthetic Biology

# Application: Translocations with remediation





# Landscapes of interest for *Aedes aegypti*



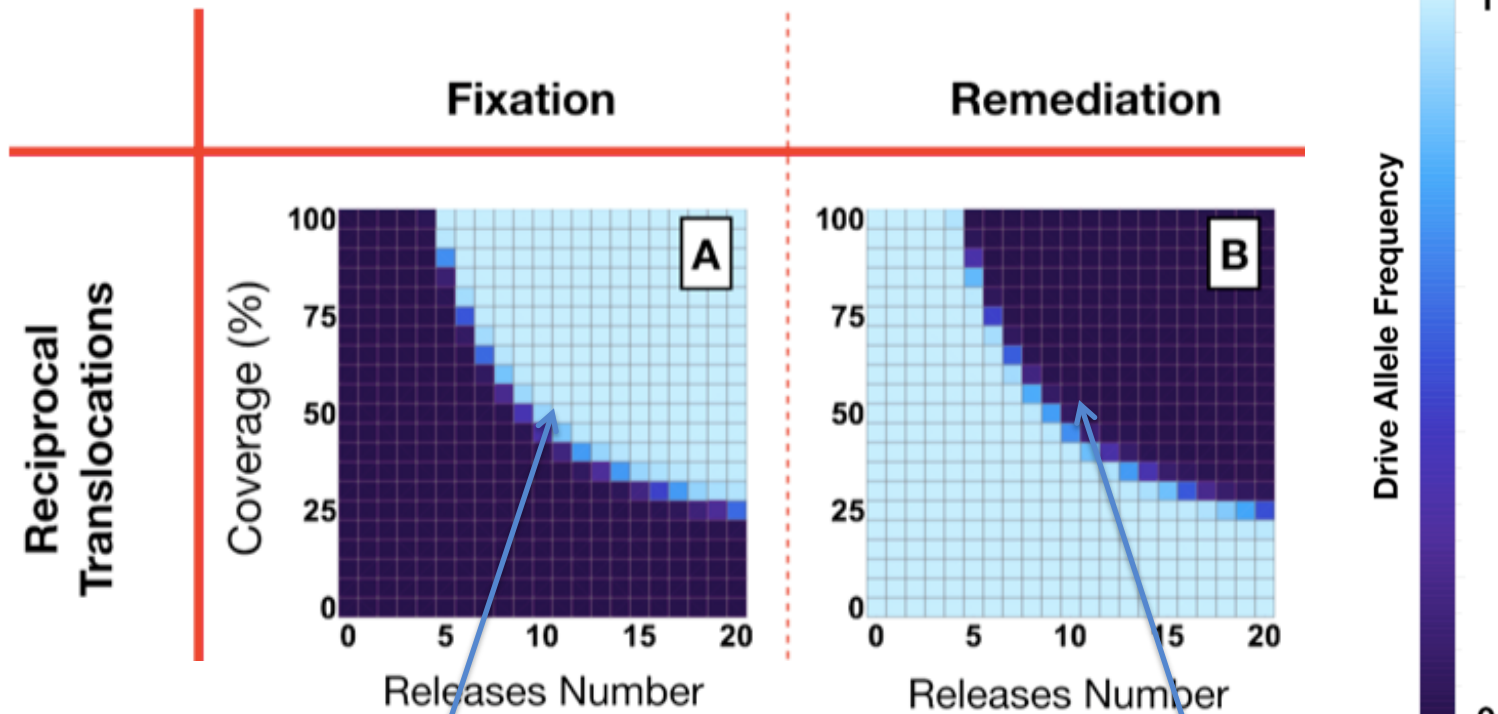






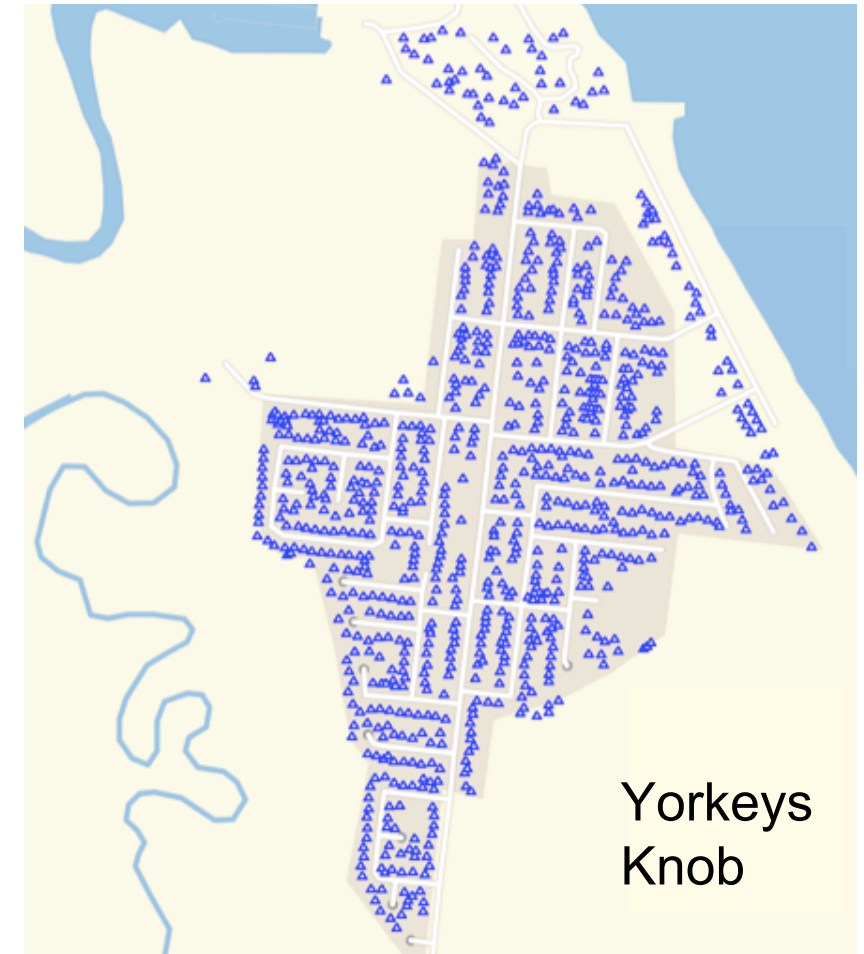
# Application: Replacement & remediation of translocations

- Data suggests there are ~15 adult *Ae. aegypti* per household
- Weekly releases of 20 adult males having the translocation
- Vary household coverage & number of releases



At a coverage level of 50%,  
≥10 releases result in fixation

At a coverage level of 50%,  
≥10 releases result in remediation



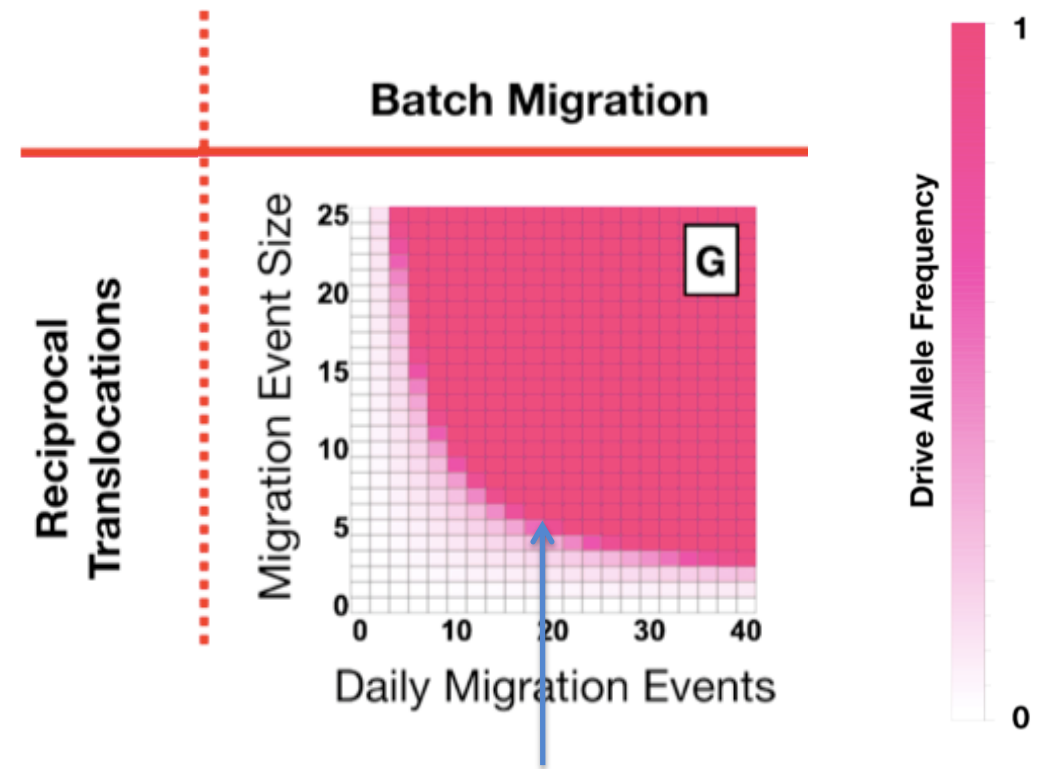
- Sánchez HM, Bennett JB, Wu SL, Rasic GL, Akbari OS, Marshall JM (2019) bioRxiv



# Application: Confinement of translocations



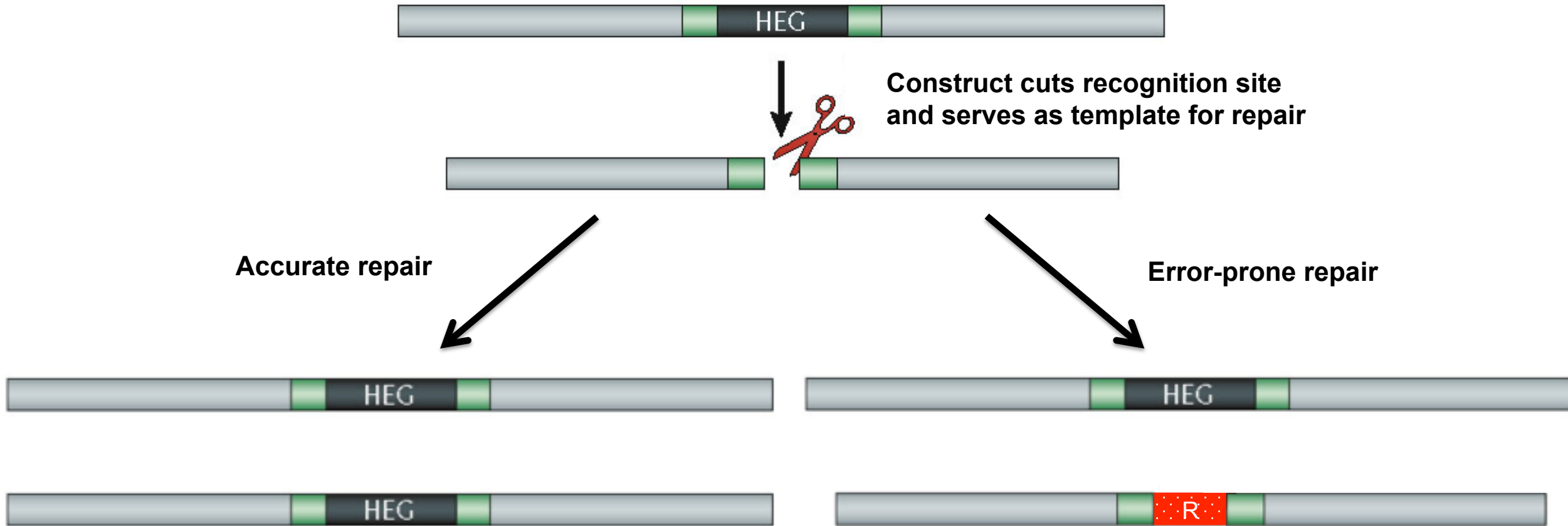
- Consider translocations fixing in Yorkeys Knob
- Consider batches of *Ae. aegypti* being transported from Yorkeys Knob to Trinity Park by human transport
- Vary size & number of daily migration events



For a batch size of 5 adults,  
≥20 daily batch migration events required

- Sánchez HM, Bennett JB, Wu SL, Rasic GL, Akbari OS, Marshall JM (2019) bioRxiv

# Q2. Can CRISPR-based gene drive be effective at controlling disease on a wide scale?

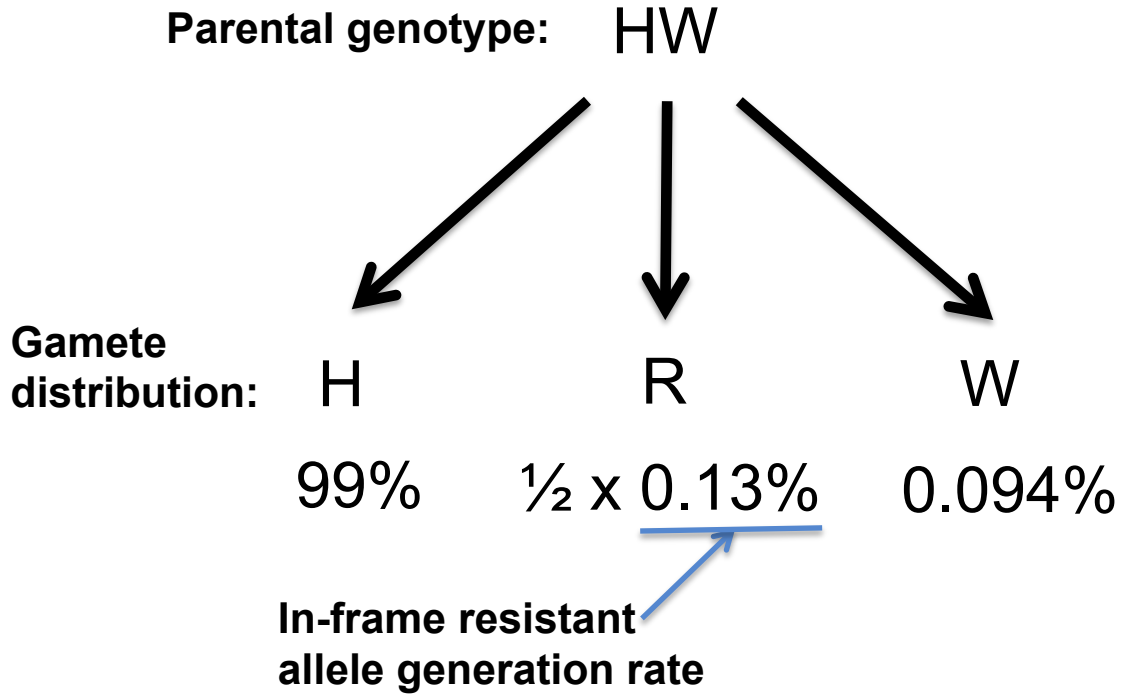
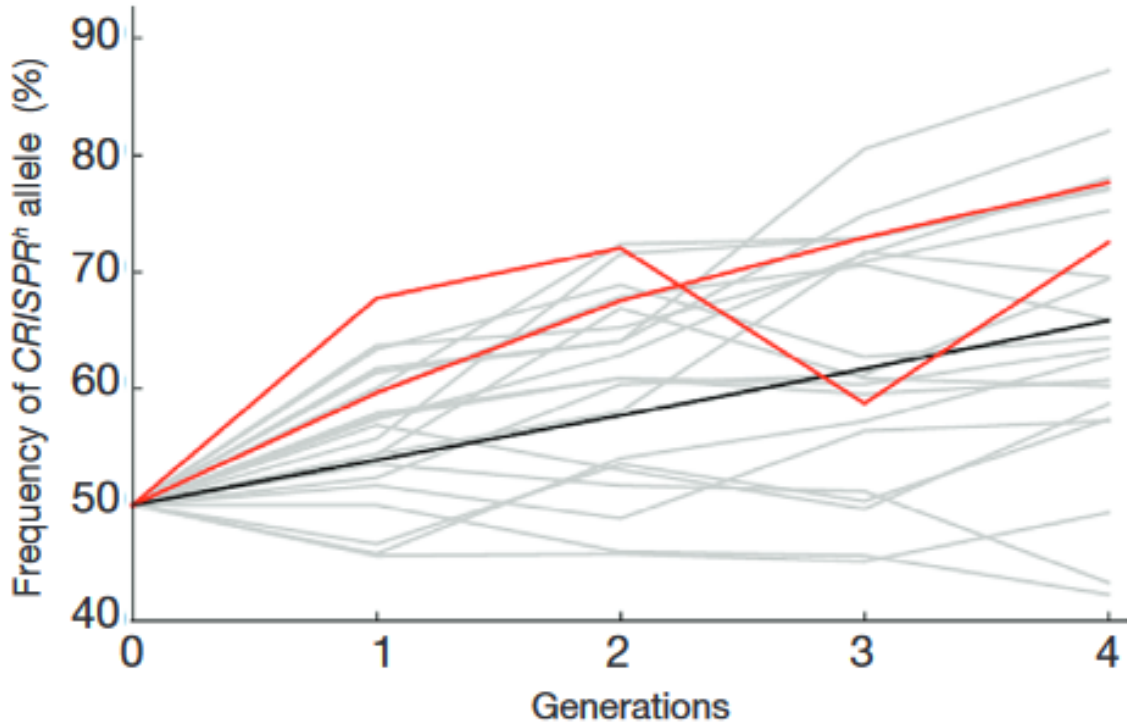


# Application: Homing drive targeting female fertility gene

## LETTERS

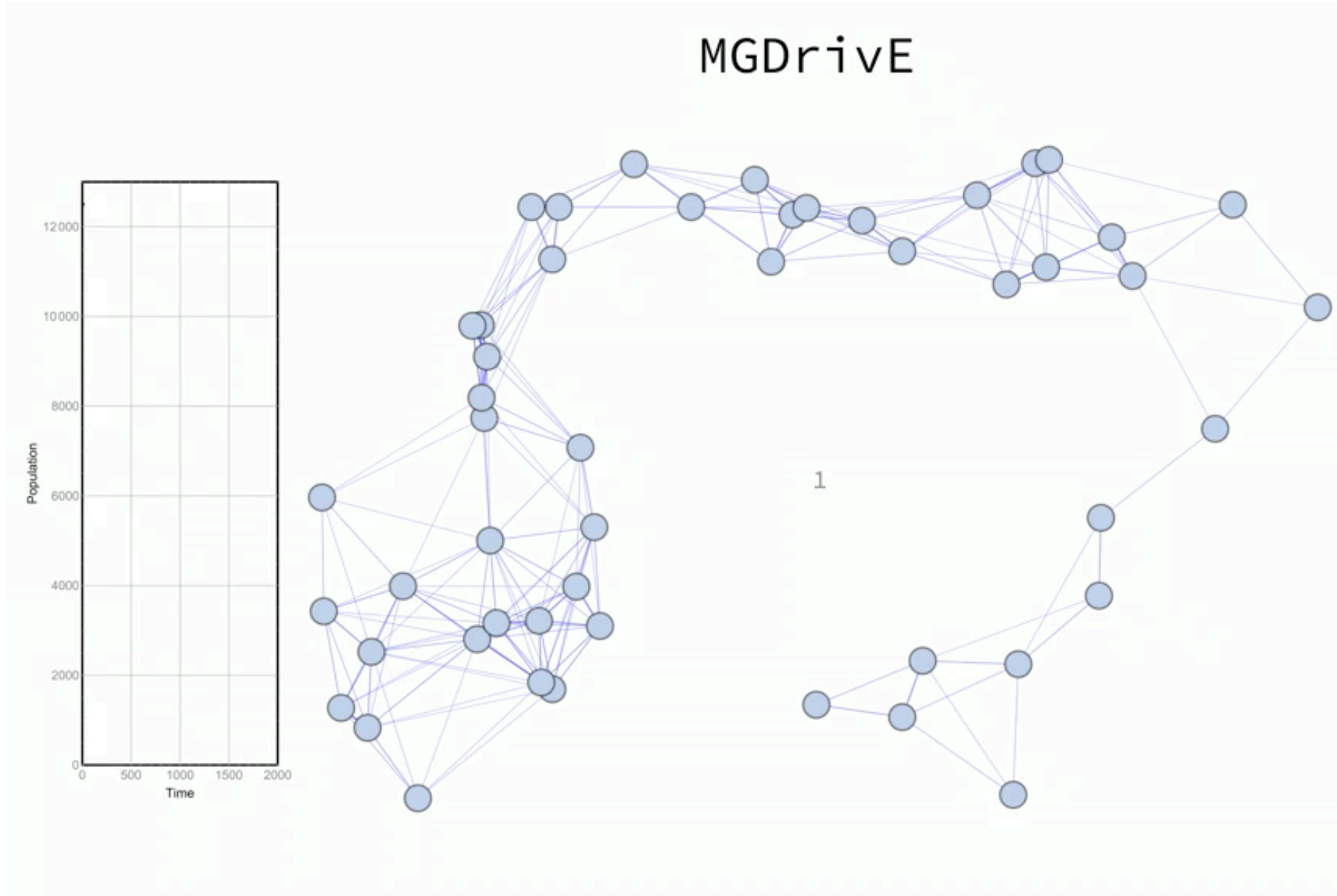
nature  
biotechnology

A CRISPR-Cas9 gene drive system targeting female reproduction in the malaria mosquito vector *Anopheles gambiae*



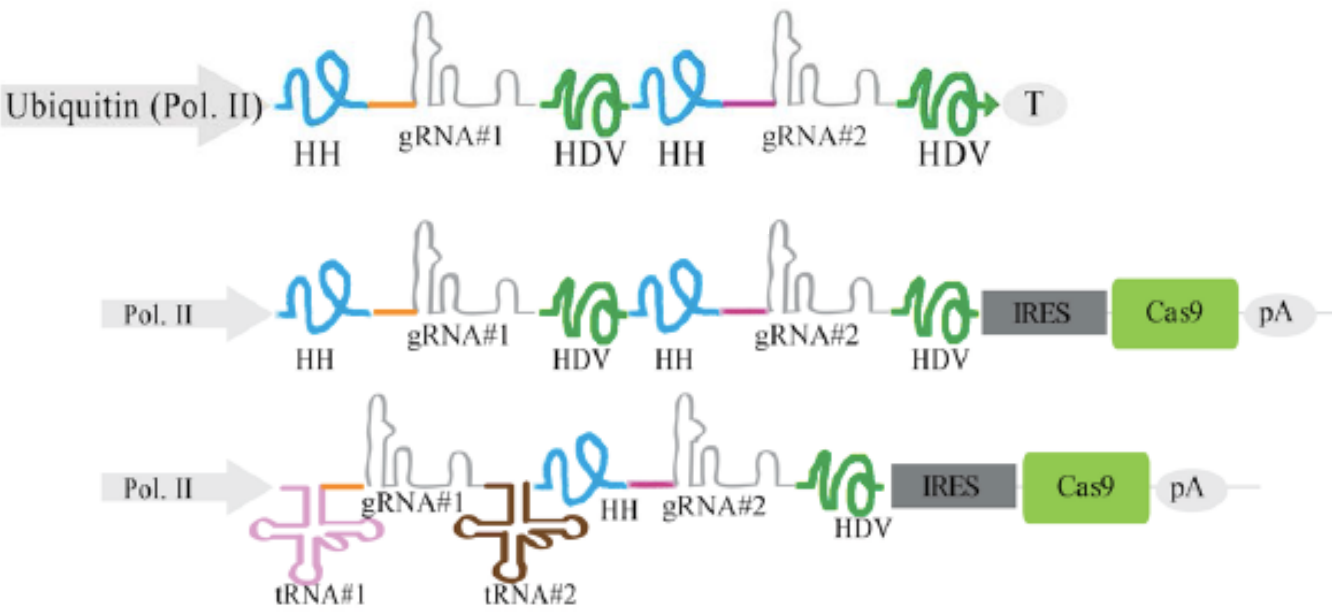
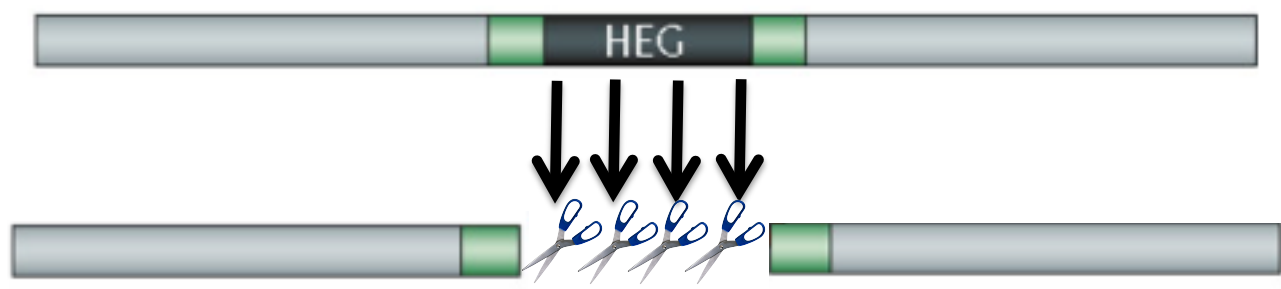
• Hammond A, Galizi R, Kyrou K, Simoni A, ..., Windbichler N, Crisanti A, Nolan T (2016) Nature Biotechnology 34: 78-83

# Application: Homing drive targeting female fertility gene





# Application: Homing drive targeting female fertility gene








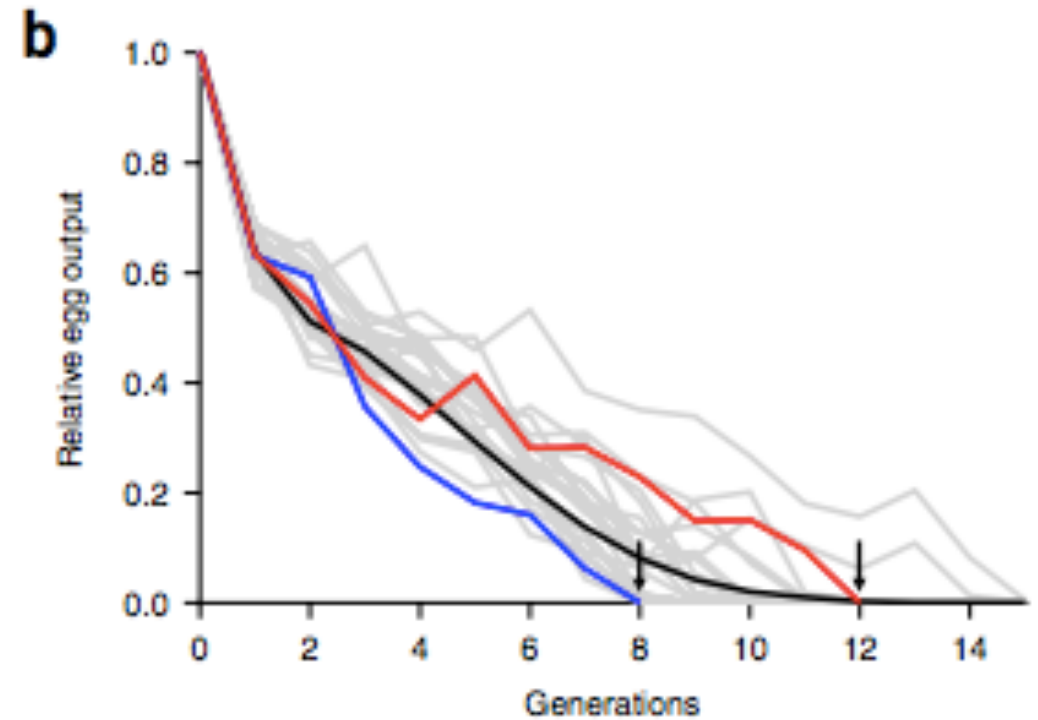
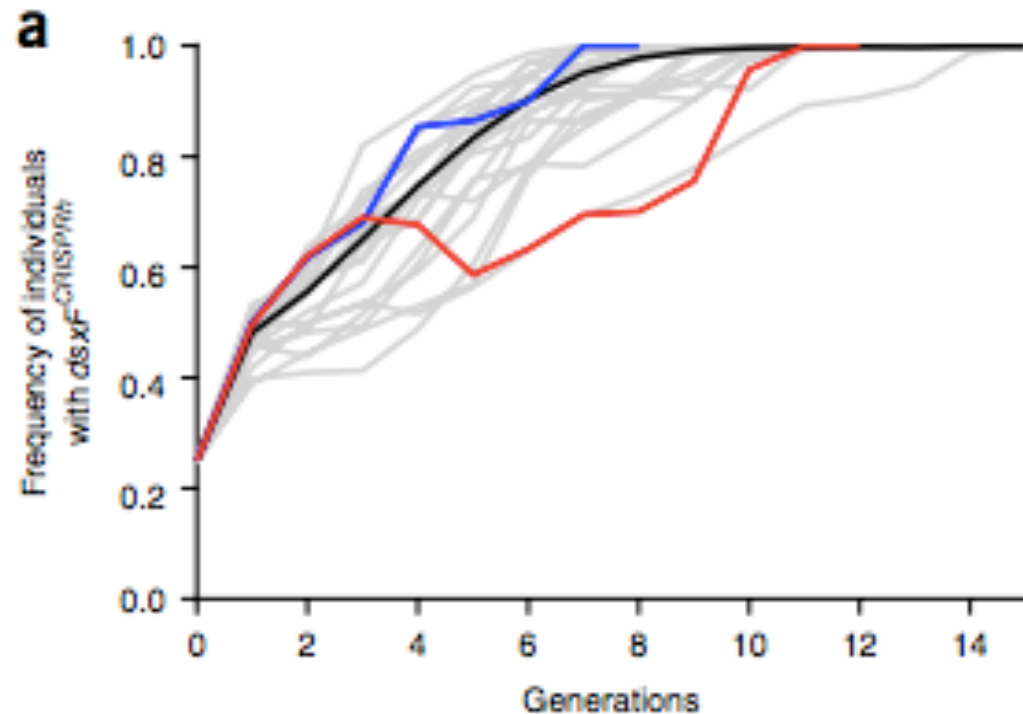
Multiplex number:	In-frame resistant allele generation rate:	Population size capable of eliminating (90% of simulations):
1	0.13%	32
2	0.00017%	24 thousand
3	$2.2 \times 10^{-9}$	19 million
4	$2.9 \times 10^{-12}$	14 billion

• Marshall JM, Buchman A, Sanchez HM, Akbari OS (2017) Nature Sci Rep 7: 3776

# A CRISPR–Cas9 gene drive targeting *doublesex* causes complete population suppression in caged *Anopheles gambiae* mosquitoes

nature  
biotechnology

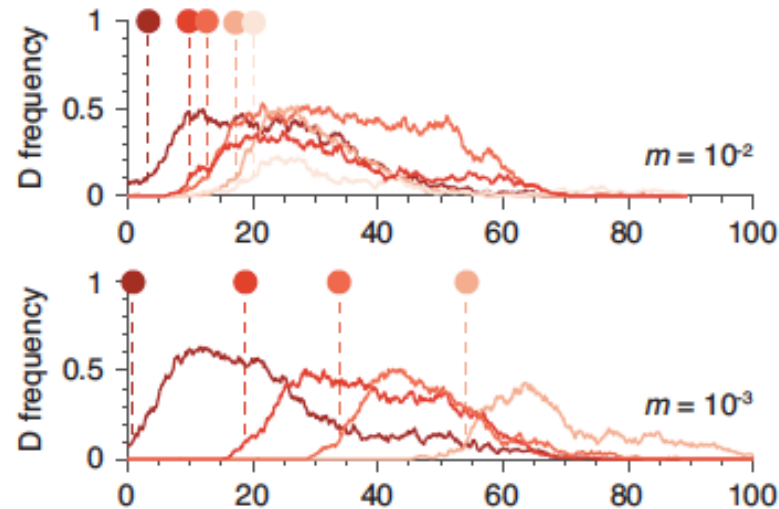
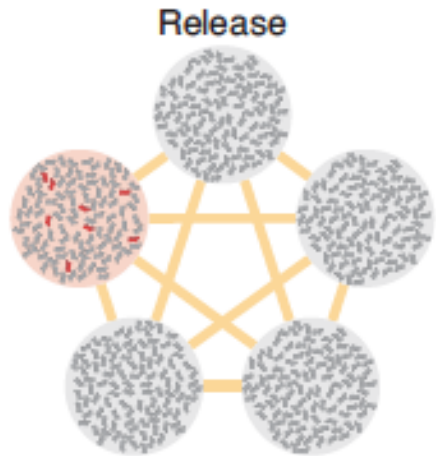
Kyros Kyrou<sup>1,2</sup> , Andrew M Hammond<sup>1,2</sup> , Roberto Galizi<sup>1</sup> , Nace Kranjc<sup>1</sup> , Austin Burt<sup>1</sup>,  
Andrea K Beaghton<sup>1</sup>, Tony Nolan<sup>1</sup>  & Andrea Crisanti<sup>1</sup>



- Kyros K, Hammond AM, Galizi R, ..., Nolan T, Crisanti A (2018) Nature Biotechnol 36, 1062–1066

## Current CRISPR gene drive systems are likely to be highly invasive in wild populations

Charleston Noble<sup>1,2,3†</sup>, Ben Adlam<sup>1,4†</sup>, George M Church<sup>2,3</sup>, Kevin M Esvelt<sup>5\*</sup>, Martin A Nowak<sup>1,6,7\*</sup>



The New York Times

MATTER

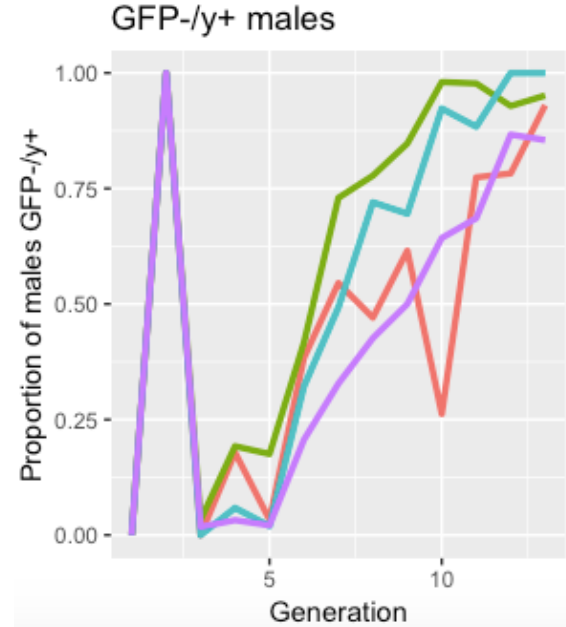
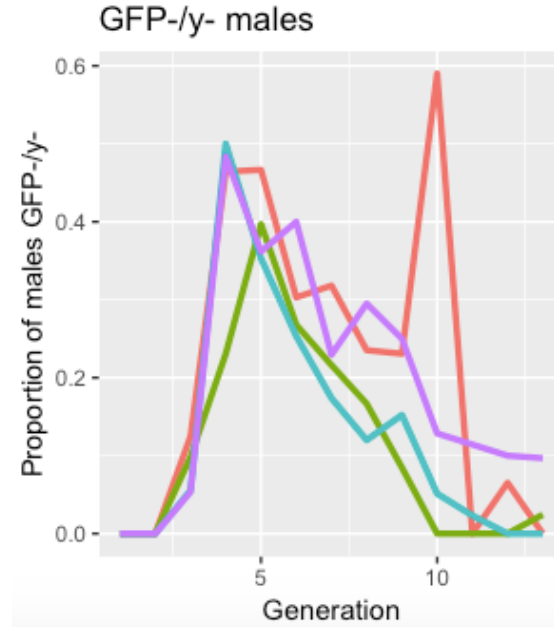
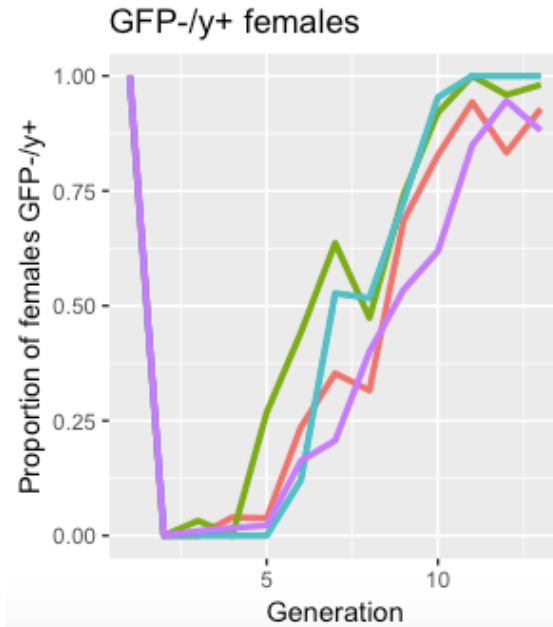
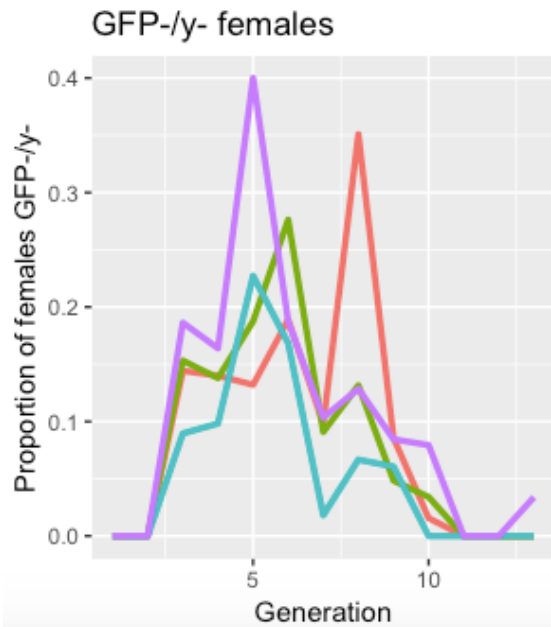
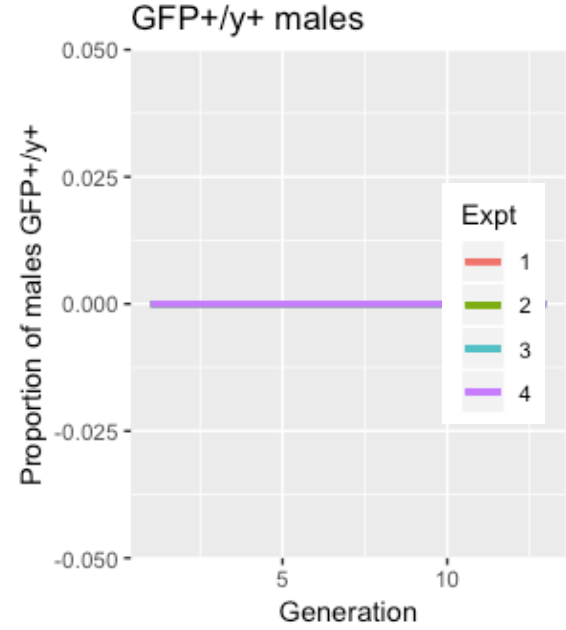
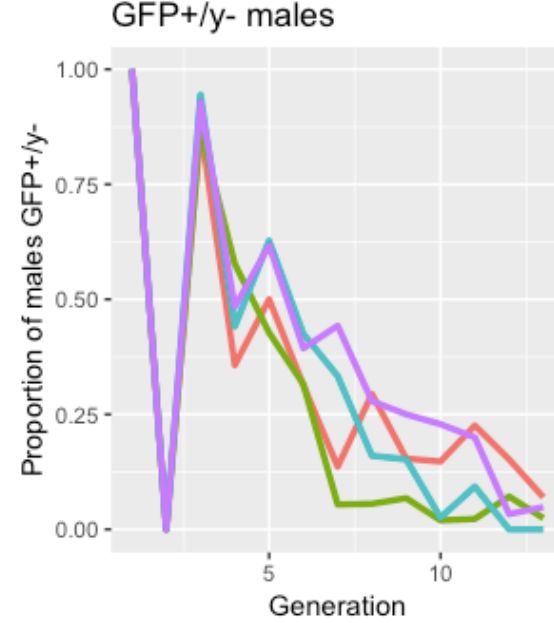
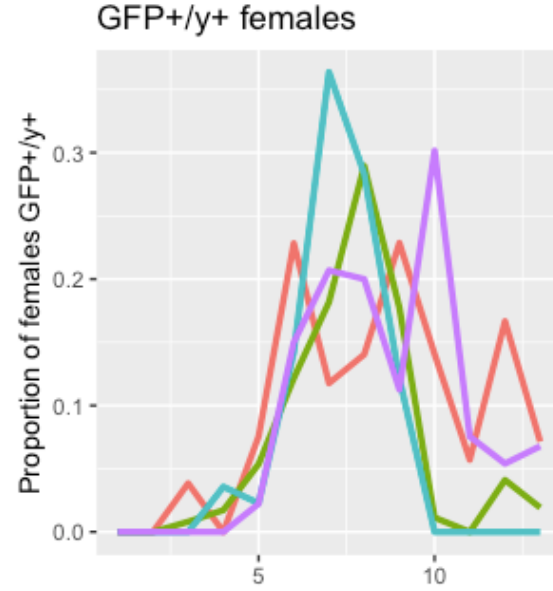
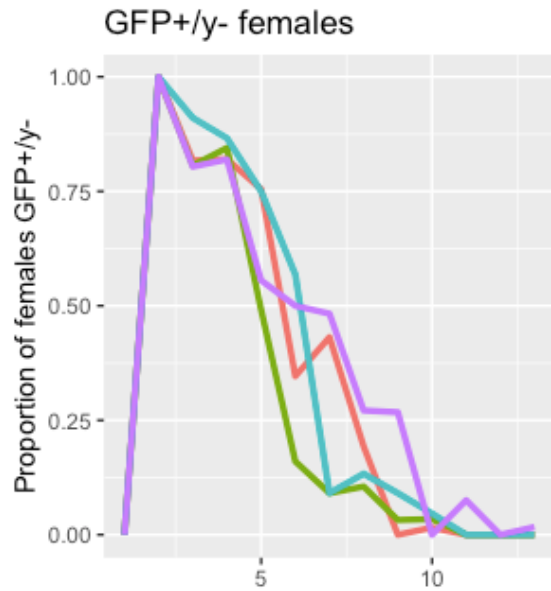
## ‘Gene Drives’ Are Too Risky for Field Trials, Scientists Say

That may well mean that experiments in the real world are just too risky right now.

“The very idea of a field trial is that it’s a trial that’s confined to an area,” Dr. Esvelt said. “Our model indicates that this is not the case.”

“It’s an important contribution,” said John M. Marshall, a mathematical biologist at the University of California, Berkeley, said of the new research. “A study like this is the beginning of a formal analysis we need.”

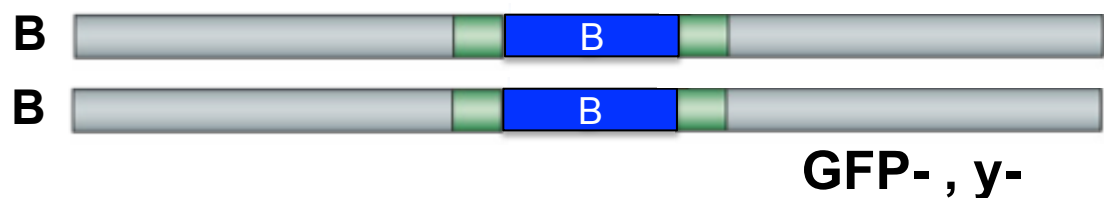
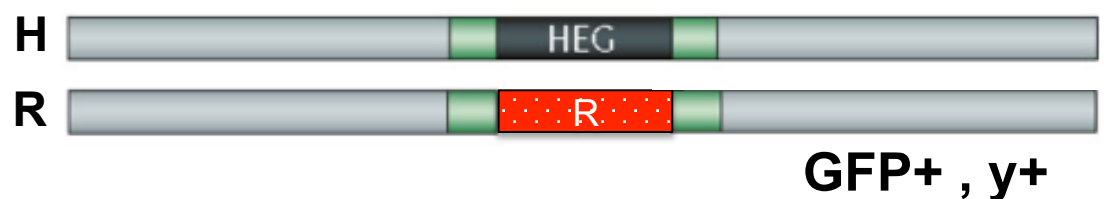
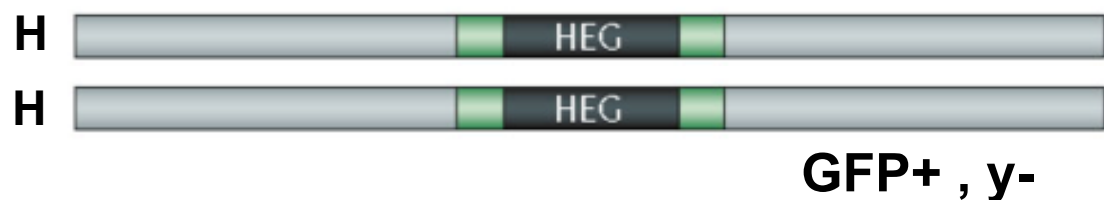
# MCR homing drive construct from Bier Lab, UCSD



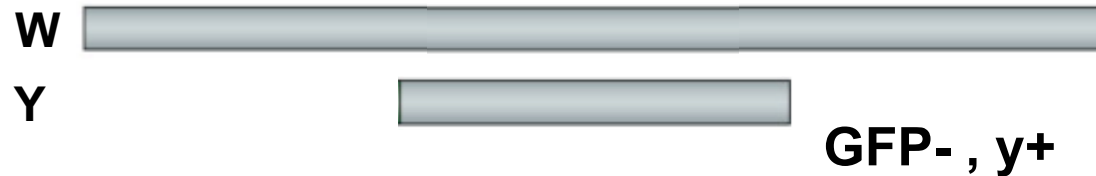
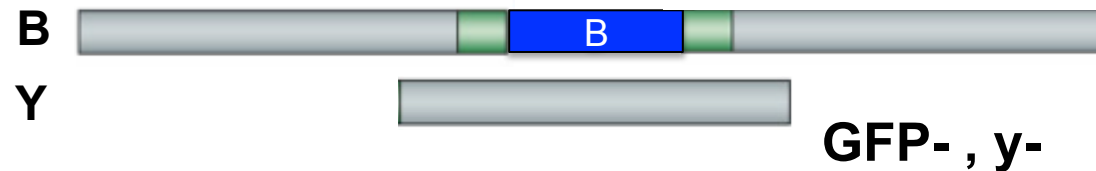
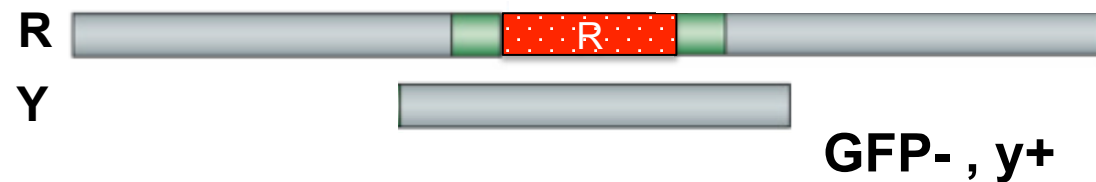
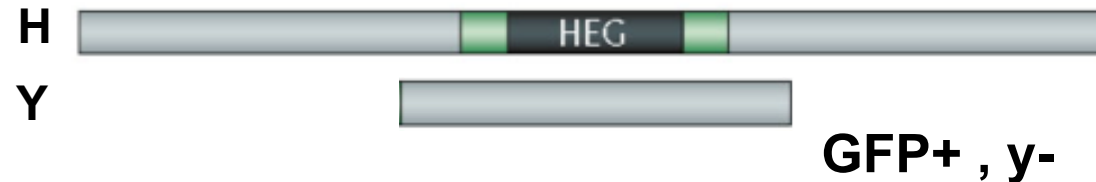


# Model fitting: Current homing-based drive system

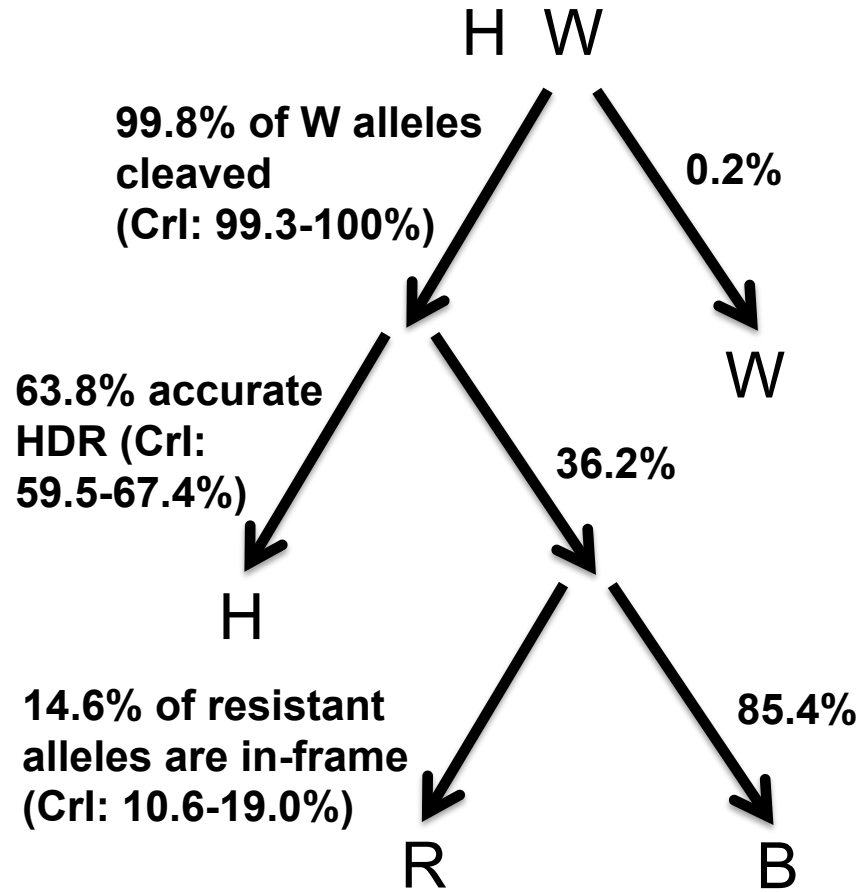
Female:



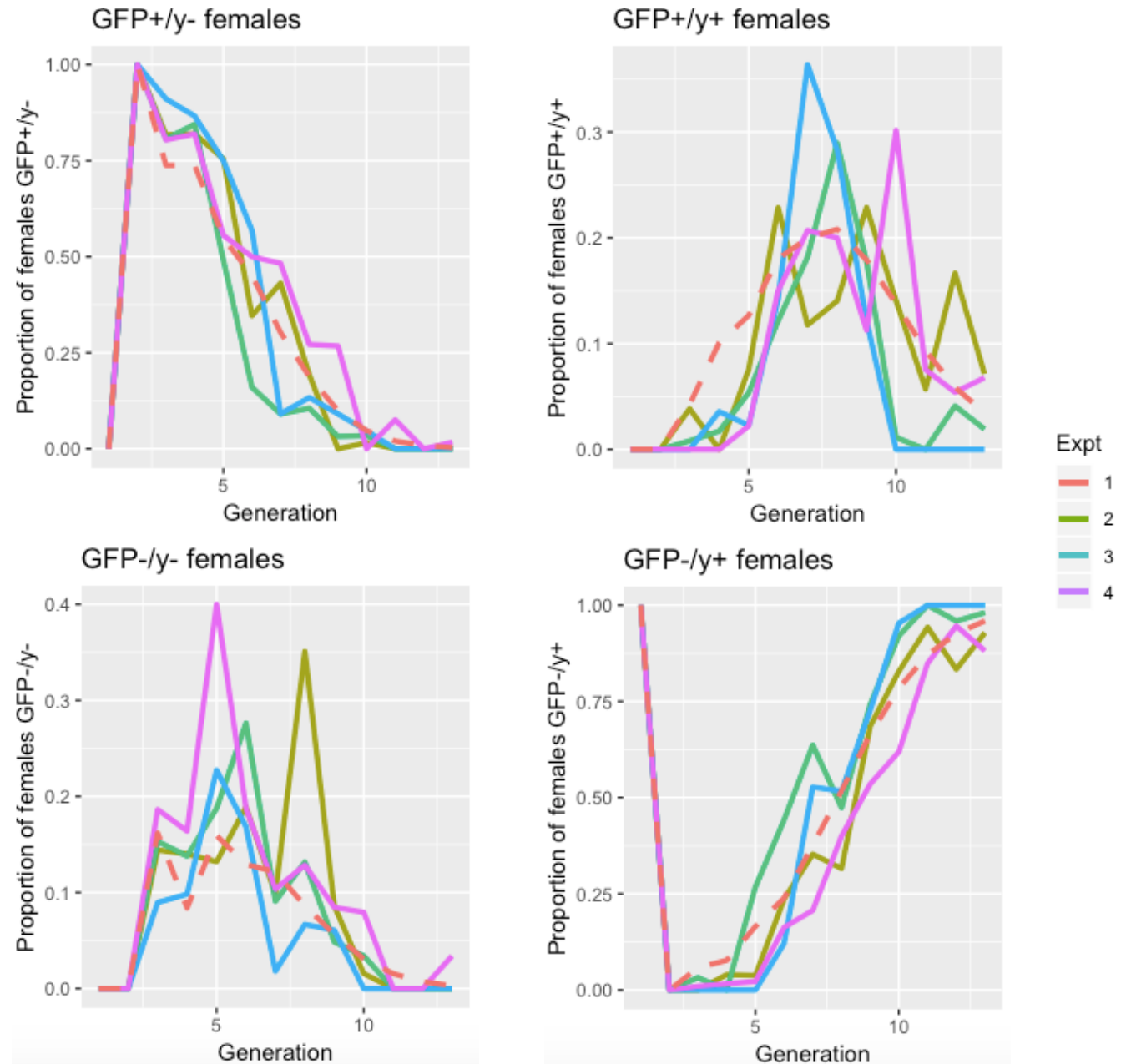
Male:



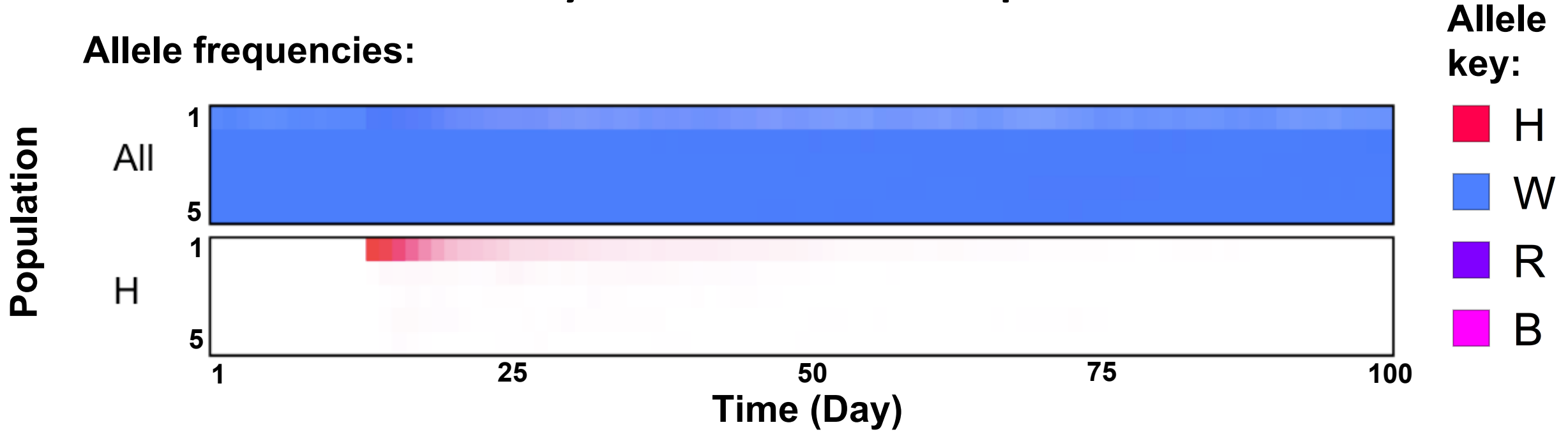
# Model fitting: Current homing-based drive system



- Fitness cost of H allele = 46.6% (Crl: 45.1-47.9%)
- Fitness cost of B allele = 37.9% (Crl: 36.3-39.4%)

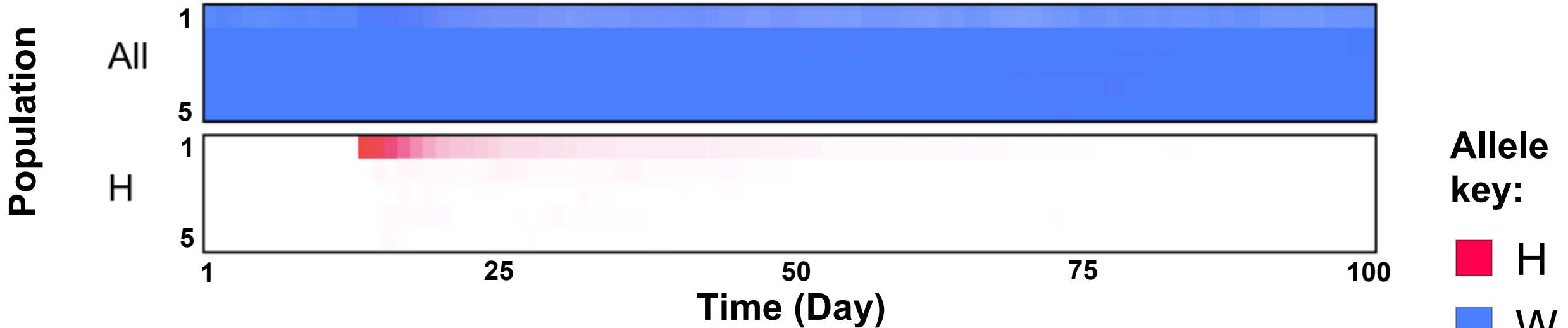


# Current systems don't spread far

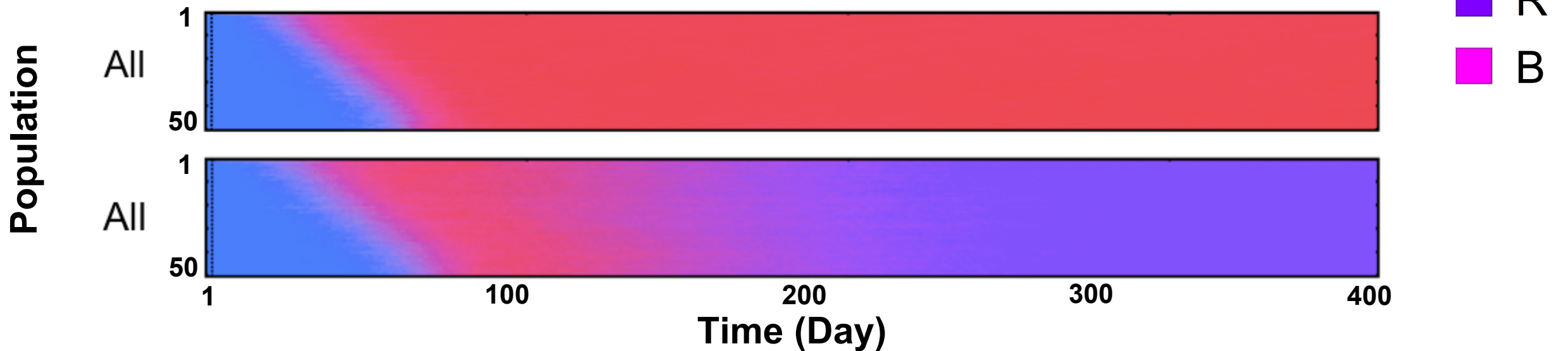


# Current systems don't spread far... but others might

Allele frequencies (current system):

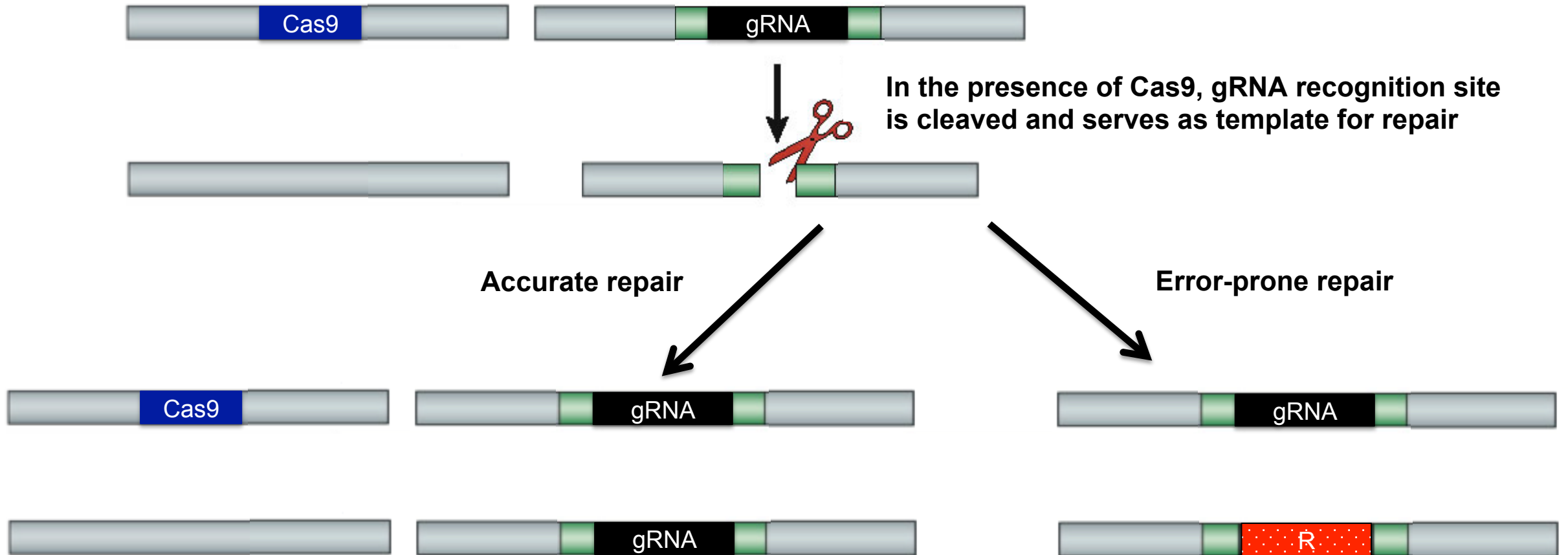


Allele frequencies (two other homing systems):



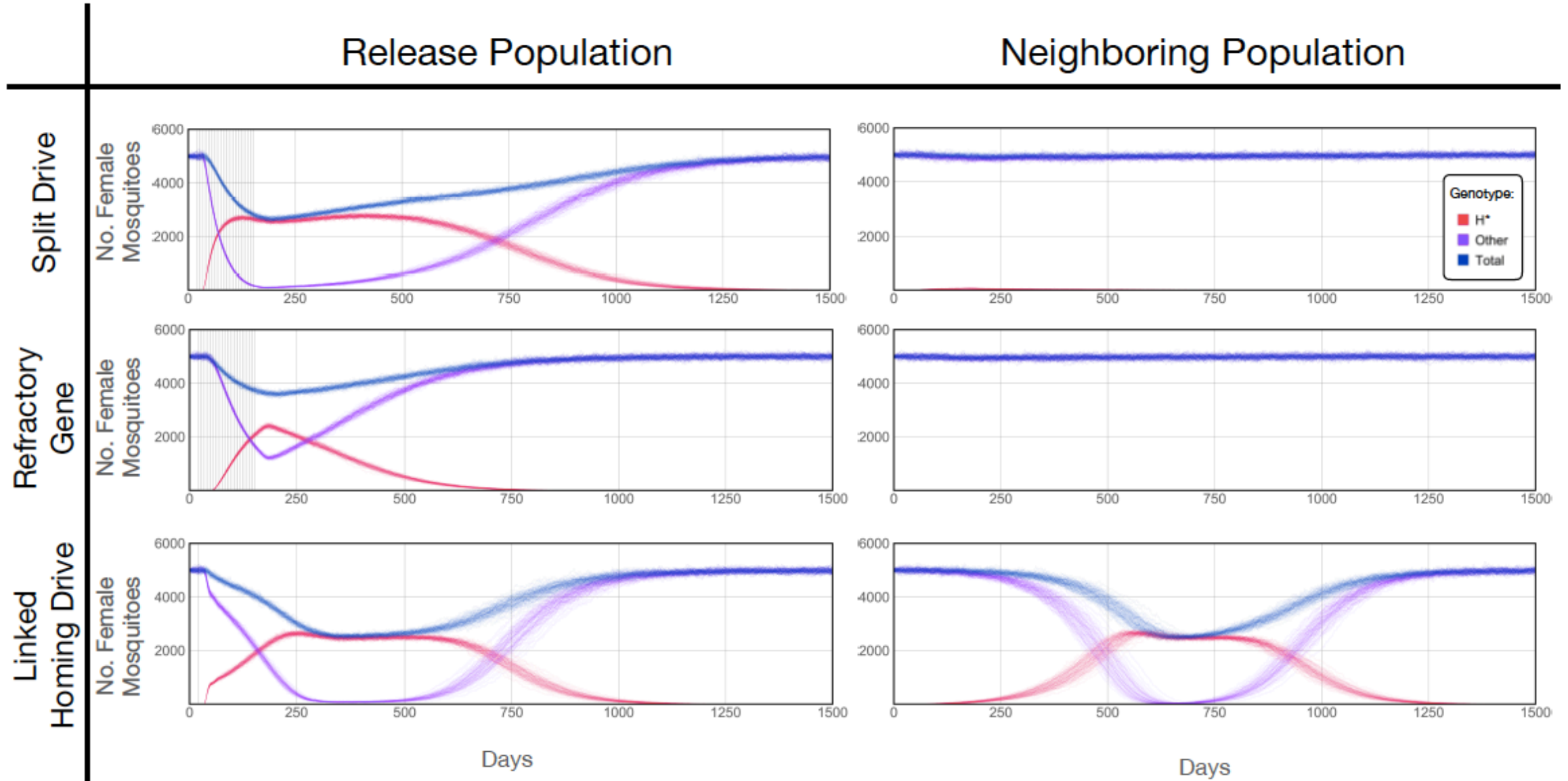


# Application: CRISPR-based split drive



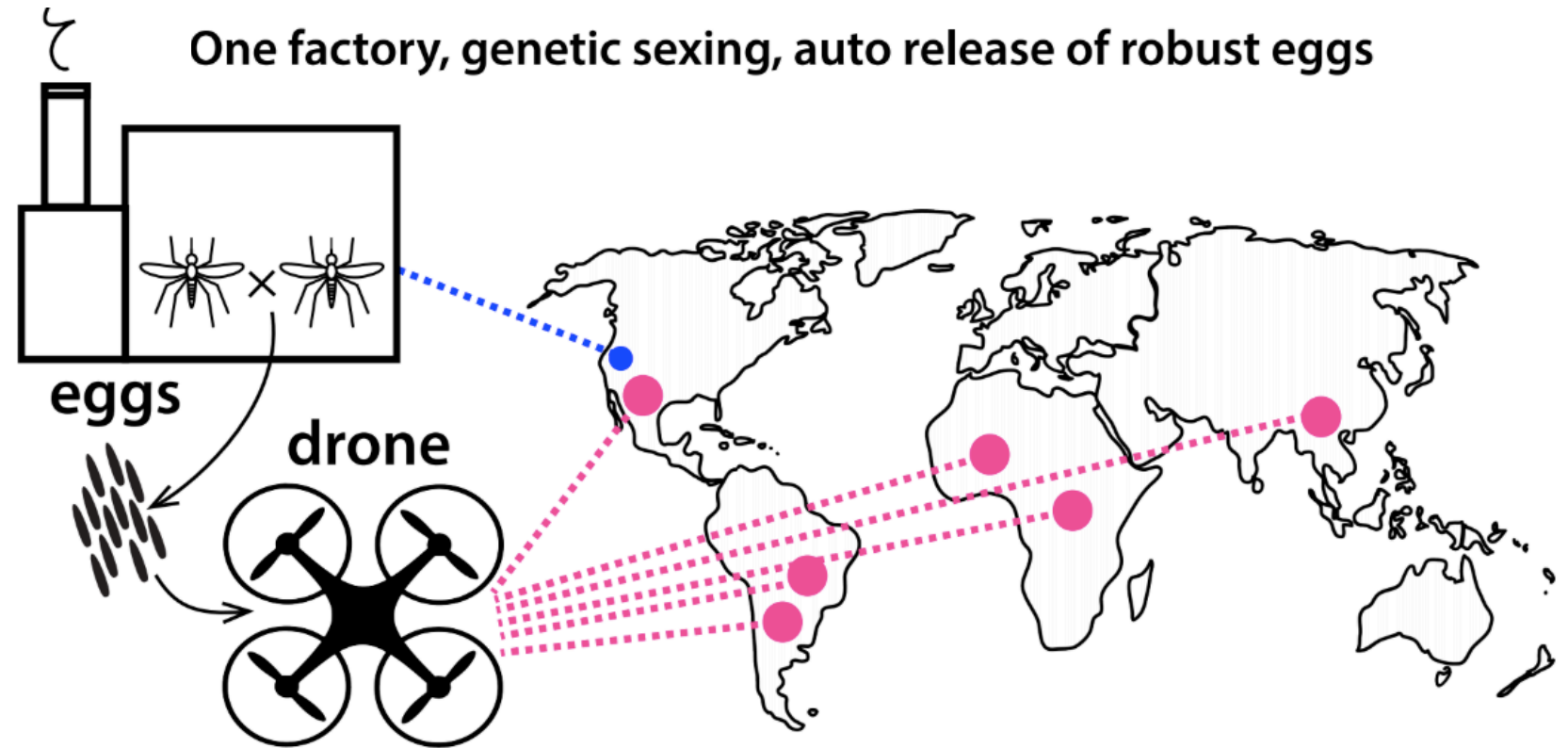
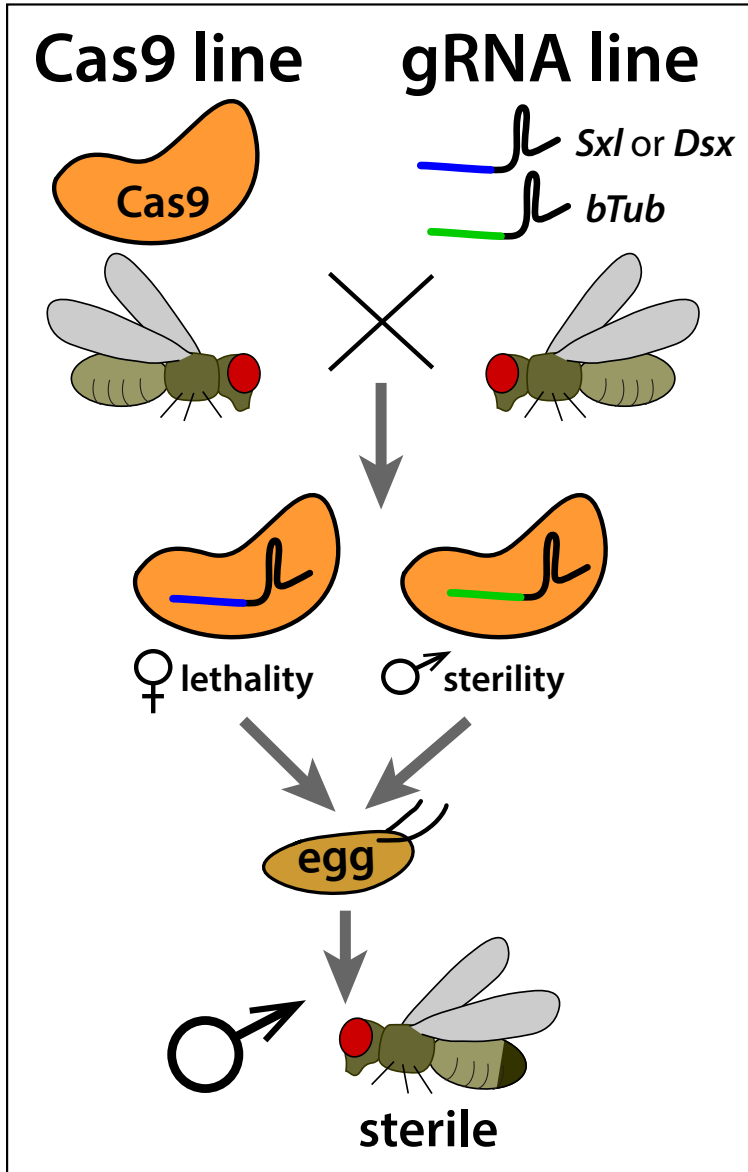
- Li M, Yang T, Kandul N, Biu M, Gamez S, Bennett JB, Sánchez HM, ..., Marshall JM, Akbari OS (2019) bioRxiv

# Application: CRISPR-based split drive



- Li M, Yang T, Kandul N, Bui M, Gamez S, Bennett JB, Sánchez HM, ..., Marshall JM, Akbari OS (2019) bioRxiv

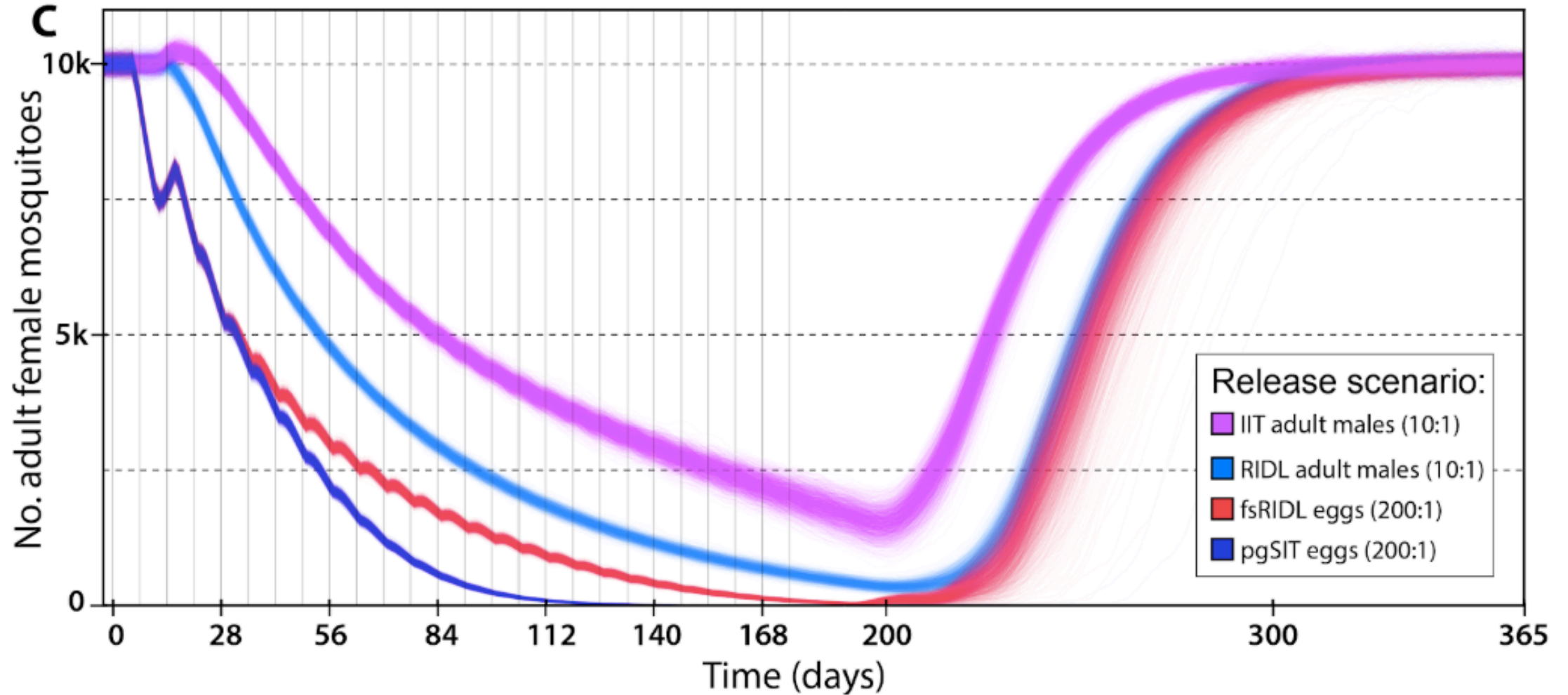
# Application: Precision-guided sterile insect technique



- Kandul NP, Liu J, Sánchez HM, Wu SL, Marshall JM, Akbari OS (2019) Nature Communications 10: 84

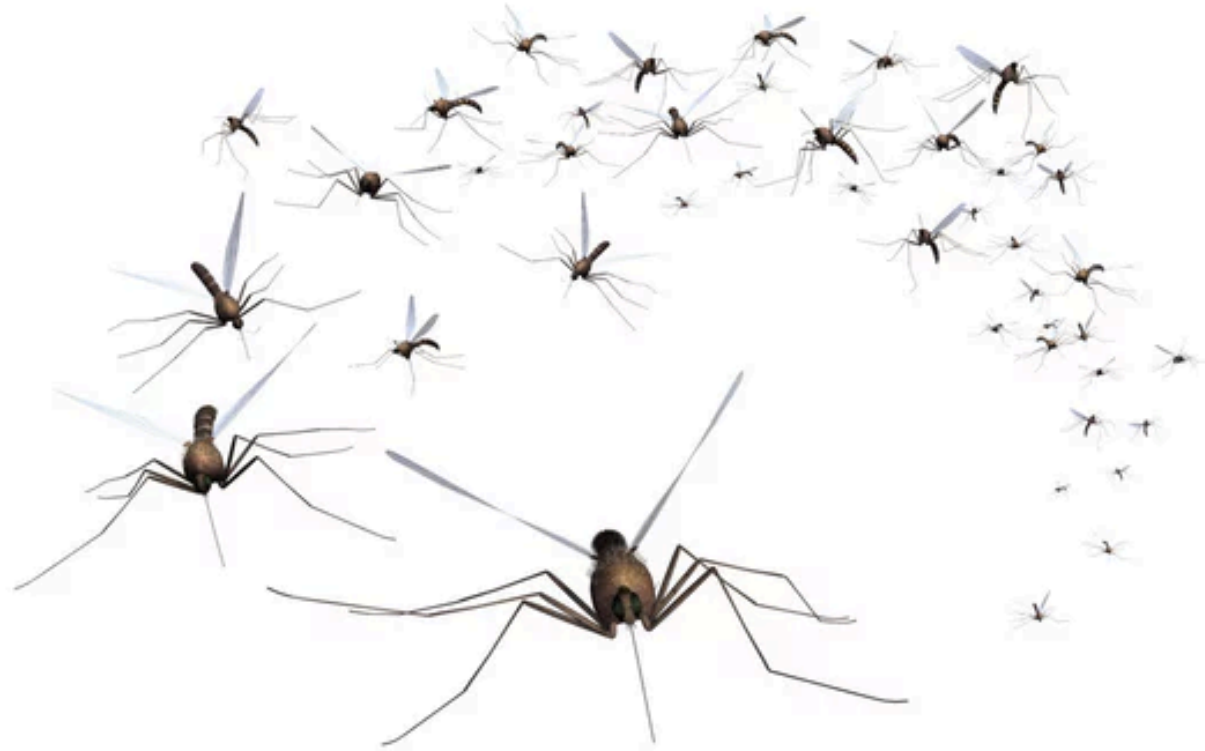


# Application: Precision-guided sterile insect technique



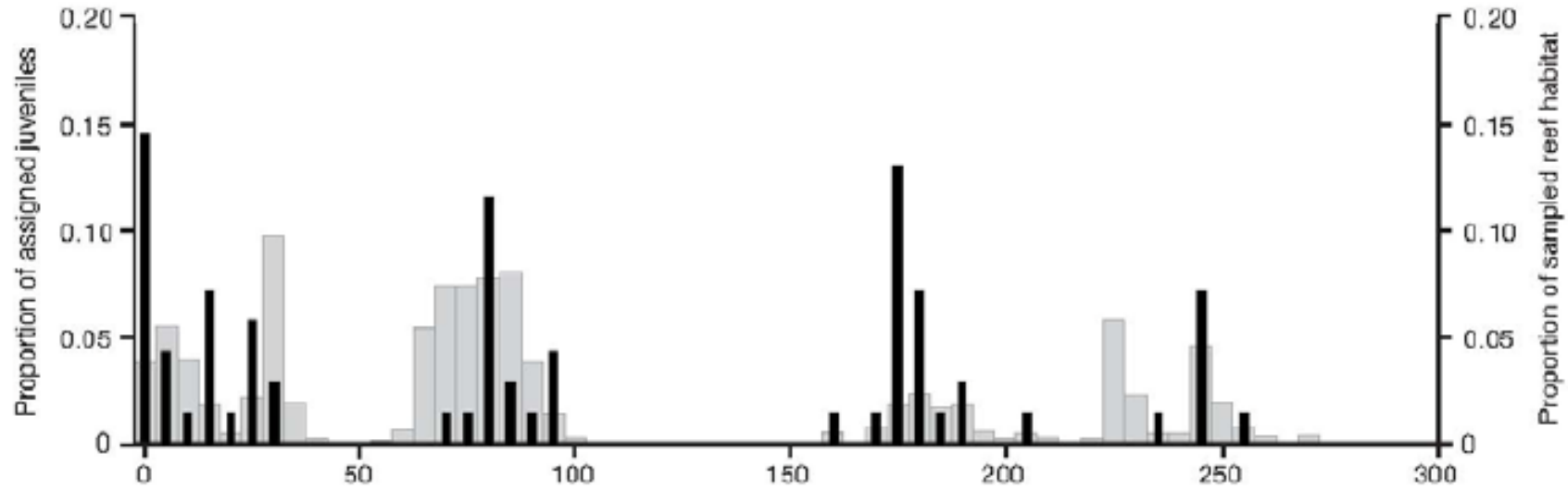
- Kandul NP, Liu J, Sánchez HM, Wu SL, Marshall JM, Akbari OS (2019) Nature Communications 10: 84

Q3. What are the best approaches for quantifying mosquito movement patterns of relevance to both questions?

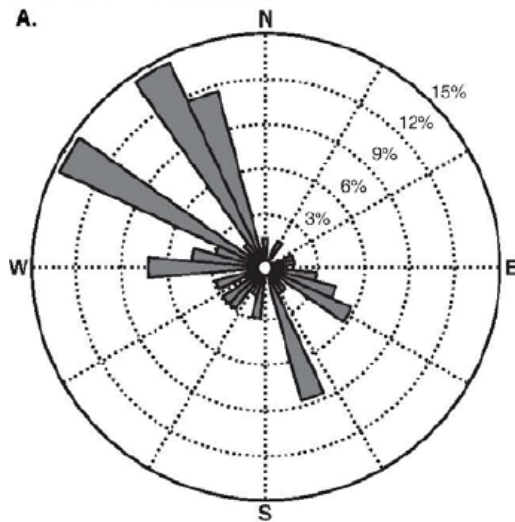


# Inspiration from coral trout

A. *Plectropomus maculatus*

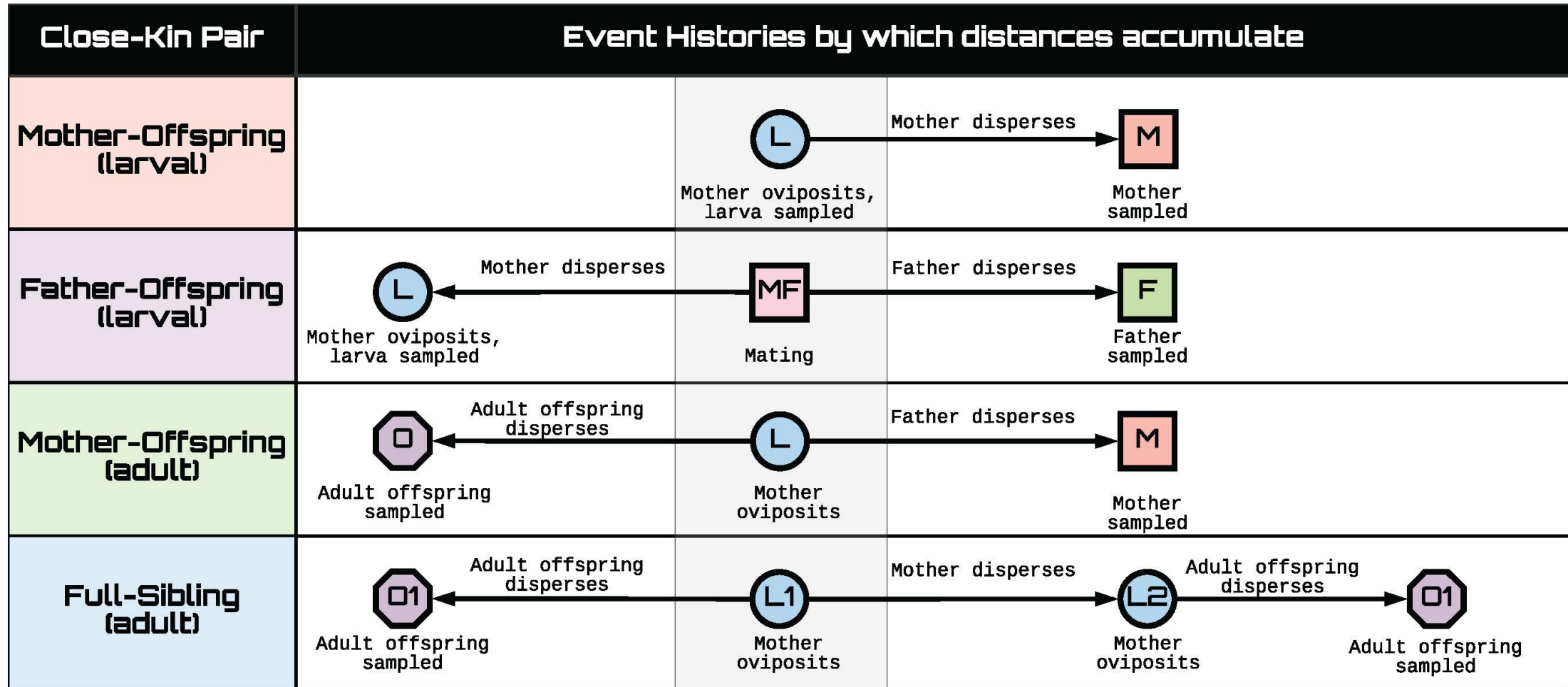


*Plectropomus maculatus*



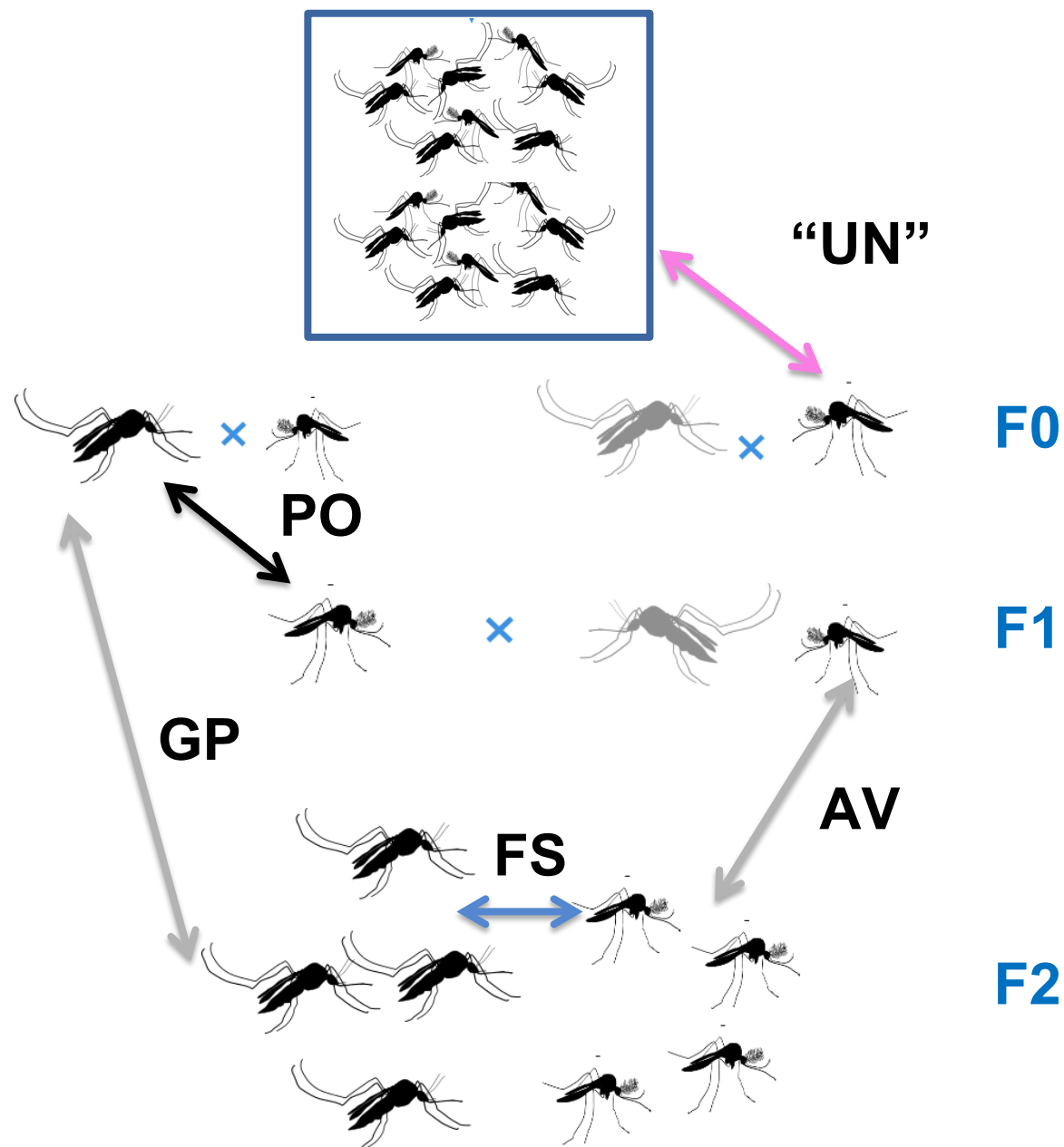
- Williamson DH, Harrison HB, Almany GR, Berumen ML *et al.* (2016) *Mol. Ecol.* 25L 6039-6054

# Close-kin genetic methods to infer mosquito dispersal





# Determining familial relationships from lab colonies



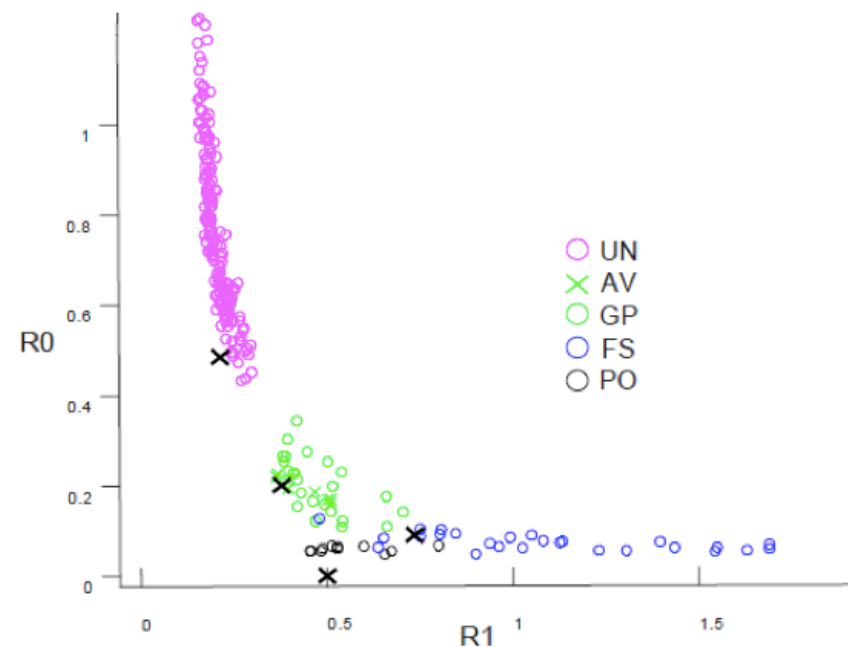
## MOLECULAR ECOLOGY

ORIGINAL ARTICLE | Open Access |

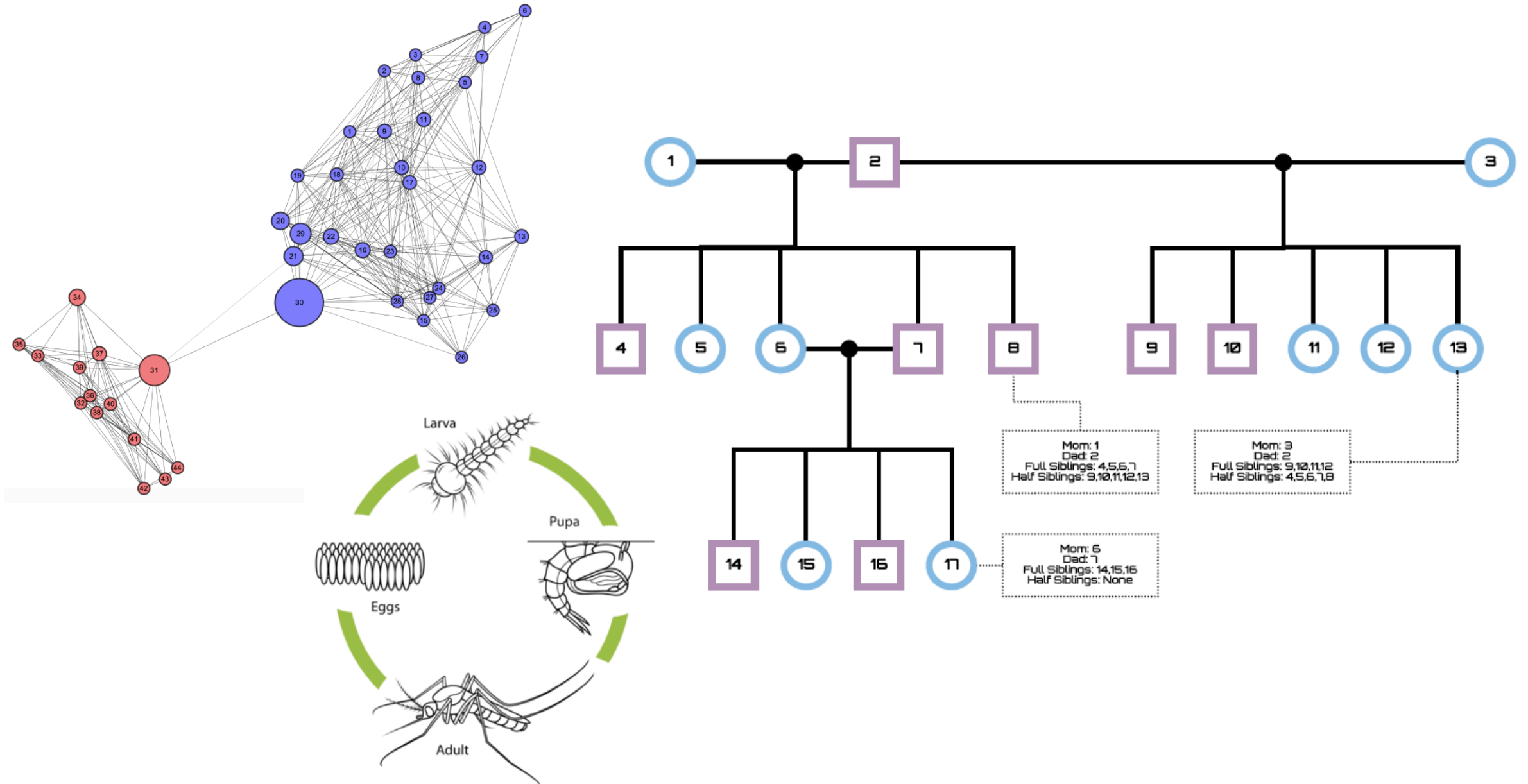
### Allele frequency-free inference of close familial relationships from genotypes or low-depth sequencing data

Ryan K. Waples, Anders Albrechtsen , Ida Moltke

First published: 21 November 2018 | <https://doi.org/10.1111/mec.14954>



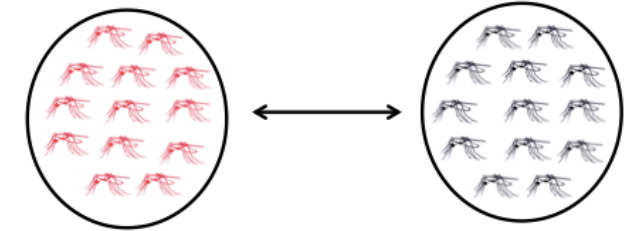
# Determining power of close-kin methods *in silico*



# Summary

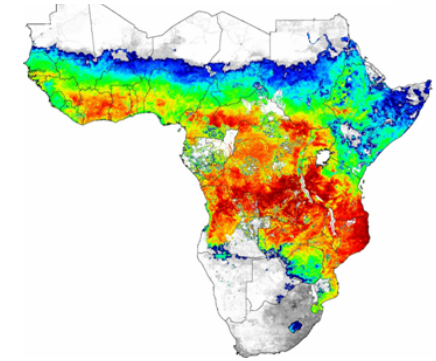
## Q1. Can we conduct a confined field trial of gene-edited mosquitoes?

- Threshold-dependent systems may be confineable to partially isolated populations
- More study is needed on population structure & batch migration



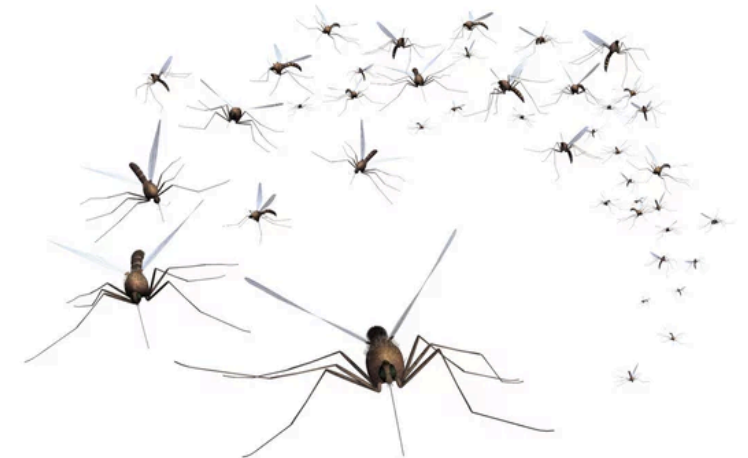
## Q2. Can CRISPR-based gene drive be effective at controlling disease on a wide scale?

- Multiplexing guide RNAs could sufficiently reduce resistant allele generation rates
- More study is needed of the molecular mechanisms
- Current homing-based drive systems are not as invasive as hyped; but future ones could be



## Q3. What are the best approaches for quantifying mosquito movement patterns?

- Close-kin capture methods are promising for inferring details of the fine-scale movement patterns of mosquitoes



# Acknowledgements

## LAB MEMBERS:

- Héctor M. Sánchez C.
- Sean L. Wu
- Jared B. Bennett
- Valeri Vasquez
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- Yi Li
- Sarafina Smith
- Thien-An Ha
- Gillian Chu
- Maya Shen

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- **Lanzaro Lab @ UC Davis**
- **James Lab @ UC Irvine**
- **Bier Lab @ UCSD**
- **Hay Lab @ Caltech**
- **Malaria Elimination Initiative @ UCSF**
- **Prof David Smith @ IHME, UW**
- **School of Public Health @ UC Berkeley**

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