#### International Conference on Entomology, 26th September 2016

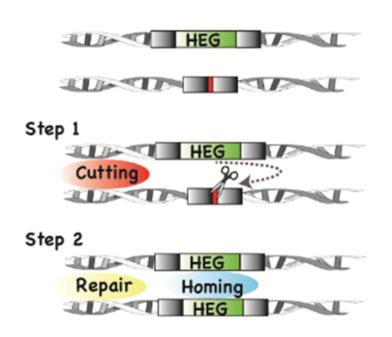
### Gene drive: What is possible at the population level with currently-available molecular components?

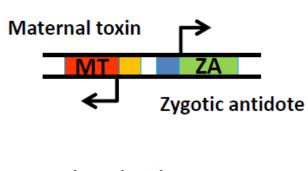
John Marshall<sup>1</sup>, Anna Buchman<sup>2</sup>, Hector Sanchez<sup>1,3</sup>, Omar Akbari<sup>2</sup>

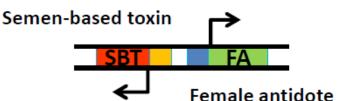
<sup>1</sup> Divisions of Biostatistics & Epidemiology, School of Public Health, University of California, Berkeley

<sup>2</sup> Department of Entomology, University of California, Riverside

<sup>3</sup> School of Medicine, Tecnologico de Monterrey, Estado de Mexico, Mexico











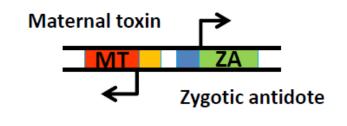
### Talk outline

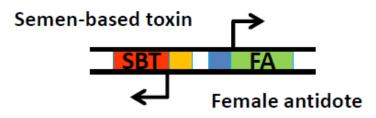
#### Toxin-antidote-based systems:

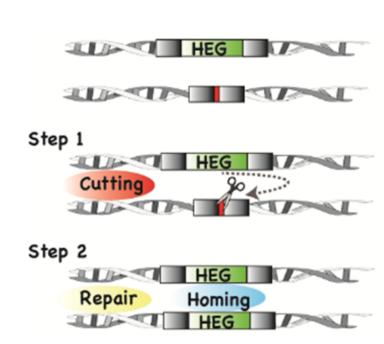
- 1. Medea, Semele, underdominance
- 2. Thresholds, confinement & reversibility
- 3. The need for spatially-structured modeling frameworks

#### **Homing-based systems:**

- 1. Multiplexing to overcome resistant allele generation
- 2. Persistence following an accidental release
- 3. Reversal drive systems & remediation strategies

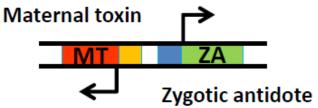


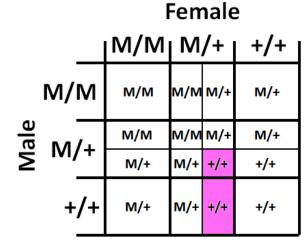


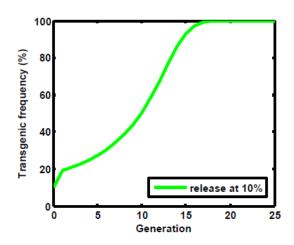




#### Medea







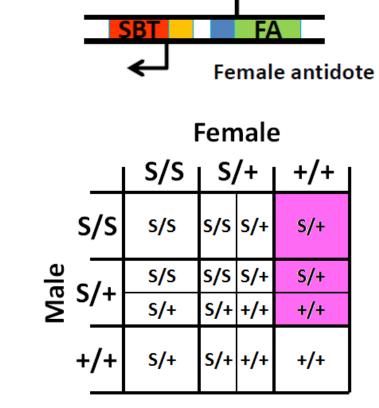
- Named after
   Medea from Greek
   mythology and
   Maternal Effect
   Dominant
   Embryonic Arrest.
- •Causes death of offspring of heterozygous mothers that do not inherit the Medea allele.
- Spreads to transgene fixation from very low initial frequencies.

Chen et al. (2007) Science

### Are there other toxin-antidote gene drive systems that could spread transgenes in a confined manner?

## GENERAL PRINCIPLES OF SINGLE-CONSTRUCT CHROMOSOMAL GENE DRIVE

John M. Marshall<sup>1,2,3</sup> and Bruce A. Hay<sup>1</sup>



Semen-based toxin

Marshall (2011) Bioeng. Bugs

Marshall & Hay (2012) J. Theor. Biol.

Marshall & Hay (2012) Evolution

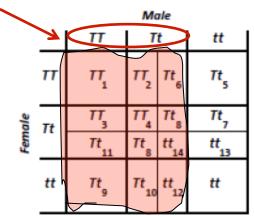
Marshall & Hay (2011) J. Hered.

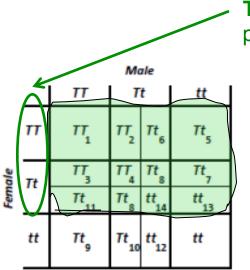
Marshall et al. (2011) Genetics

### Semele

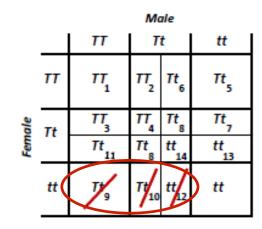


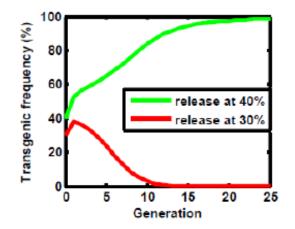
### Transgenic males produce toxic semen





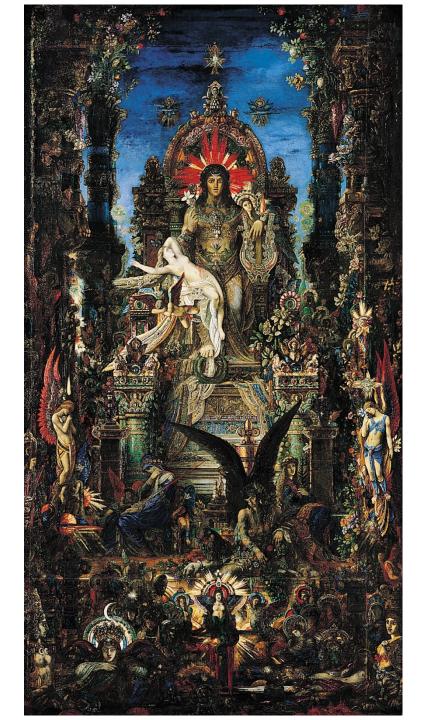
### Transgenic females produce antidote

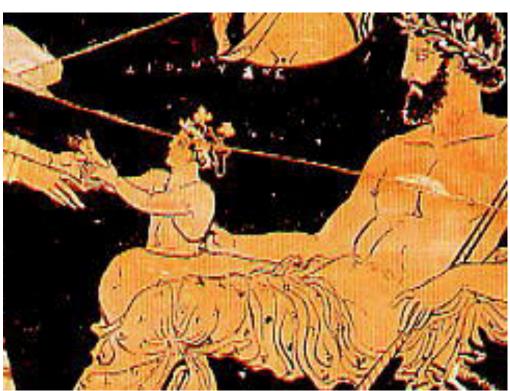




- •A release including females results in gene drive (GM females are favored at high population frequencies).
- •Release threshold = 36.4%:

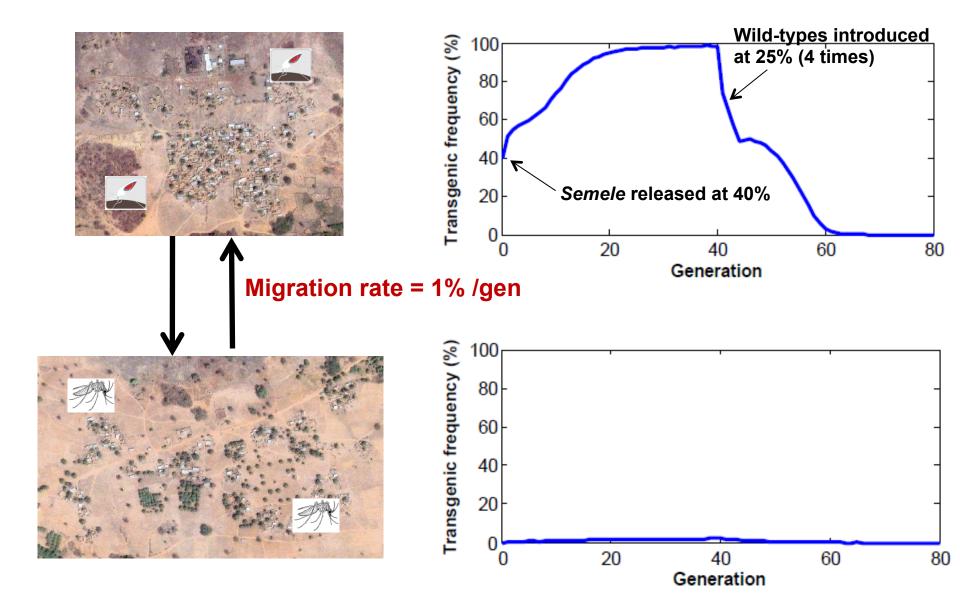
#### Marshall et al. (2011) Genetics







### Introduction of *Semele* is predicted to be confineable and reversible



#### Construct A: Construct B: Maternal Maternal Toxin 1 Toxin 2 Zygotic Zygotic Antidote 2 Antidote 1 s = 0, AABB male release Transgenic frequency (%) Offspring of mothers 100 having one or both 80 constructs must inherit the Release at: opposite or both 60 33% chromosomes to survive. 24% 23% This is more likely at higher 20 population frequencies (>24%) leading to 25 frequency-dependent Generation

drive.

Akbari\*, Matzen\*, Marshall\* et al. (2013) Curr. Biol.

### Inheritance pattern of UDMEL

#### Female

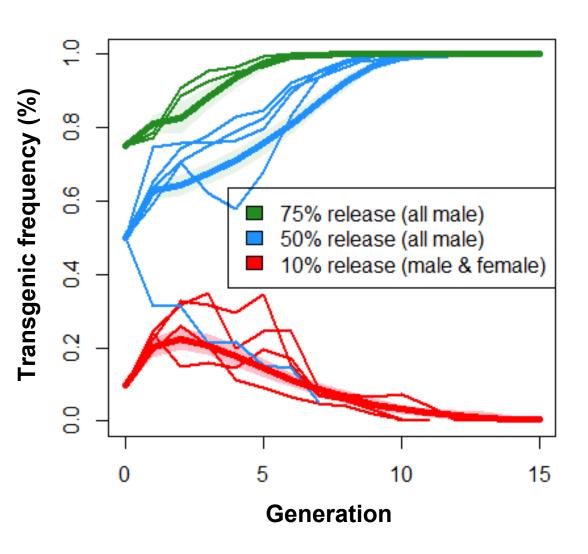
		A/A ; B/B	A/+ ; B/B	+/+ ; B/B	A/A ; B/+	A/A ; +/+	+/+ ; B/+	A/+ ; B/+	A/+ ; +/+	+/+ ; +/+
-	A/A ; B/B	A/A; B/B	A/A ; B/B A/+ ; B/B	A/+ ; B/B	A/A ; B/B A/A ; B/+	A/A ; B/+	A/+ ; B/B A/+ ; B/+	A/A ; B/B A/+ ; B/E A/A ; B/+ A/+ ; B/+		A/+ ; B/+
	A/+ ; B/B	A/A ; B/B A/+ ; B/B	A/+ ; B/B A/A ; B/B +/+ ; B/B	A/+ ; B/B +/+ ; B/B	A/A; B/B A/A; B/+ A/+; B/B A/+; B/+	A/A ; B/+ A/+ ; B/+	A/+; B/B +/+; B/B A/+; B/+ +/+; B/+	A/A; B/B A/A; B/+ A/+; B/B A/+; B/+ +/+; B/B +/+; B/+	A/+ ; B/+ A/A ; B/++/+ ; B/+	A/+ ; B/+ +/+ ; B/+
	+/+ ; B/B	A/+ ; B/B	A/+ ; B/B +/+ ; B/B	+/+ ; B/B	A/+ ; B/+ A/+ ; B/B	A/+ ; B/+	+/+ ; B/B +/+ ; B/+	A/+ ; B/B A/+ ; B/+ +/+ ; B/B +/+ ; B/+		+/+ ; B/+
	A/A ; B/+	A/A ; B/B A/A ; B/+	A/A; B/B A/+; B/B A/A; B/+ A/+; B/+	A/+ : B/+	A/A ; B/B A/A ; B/+	A/A ; B/+ A/A ; +/+	A/+ ; B/+ A/+ ; B/B A/+ ; +/+	A/A;B/B A/+;B/B A/A;B/+ A/+;B/+ A/A;+/+ A/+;+/+	A/A ; B/+ A/A ; +/+ A/+ ; B/+ A/+ ; +/+	A/+ ; B/+ A/+ ; +/+
	A/A ; +/+	A/A ; B/+	A/A ; B/+ A/+ ; B/+	A/+ ; B/+	A/A ; B/+ A/A ; +/+	A/A ; +/+	A/+ ; B/+ A/+ ; +/+	A/A; B/+ A/A; +/+ A/+; B/+ A/+; +/+	-	A/+ ; +/+
	+/+ ; B/+	A/+ ; B/B A/+ ; B/+	A/+; B/B +/+; B/B A/+; B/+ +/+; B/+	, , , , , , , , , , , , , , , , , , , ,	A/+ ; B/+ A/+ ; B/B A/+ ; +/+	A/+ ; B/+ A/+ ; +/+	+/+ ; B/B +/+ ; B/+ +/+ ; +/+	A/+; B/E +/+; B/E A/+; B/++/+; B/+ A/+; +/+ +/+; +/+	A/+ ; B/+ A/+ ; +/+ +/+ ; B/+ +/+ ; +/+	+/+ ; B/+ +/+ ; +/+
-	A/+ ; B/+	A/A; B/B A/+; B/B A/A; B/+ A/+; B/+	A/A; B/B A/A; B/+ A/+; B/B A/+; B/+ +/+; B/B +/+; B/+	A/+ ; B/B A/+ ; B/+ +/+ ; B/B +/+ ; B/+	A/A; B/B A/+; B/B A/A; B/+ A/+; B/+ A/A; +/+ A/+; +/+	A/A; B/+ A/+; B/+ A/A; +/+ A/+; +/+	A/+; B/B +/+; B/B A/+; B/+ +/+; B/+ A/+; +/+ +/+; +/+	A/A; B/B A/+; +/+ A/A; B/+ +/+; B/B A/A; +/+ +/+; B/+ A/+; B/B +/+; +/+ A/+; B/+	A/A; B/+ A/A; +/+ A/+; B/+ A/+; +/+ +/+; B/+ +/+; +/+	A/+ ; B/+ A/+ ; +/+ +/+ ; B/+ +/+ ; +/+
	A/+ ; +/+	A/A ; B/+ A/+ ; B/+	A/+ ; B/+ A/A ; B/+ +/+ ; B/+		A/A ; B/+ A/A ; +/+ A/+ ; B/+ A/+ ; +/+	A1 - 1	A/+ ; B/+ A/+ ; +/+ +/+ ; B/+ +/+ ; +/+	A/A;B/+ A/A;+/+ A/+;B/+ A/+;+/+ +/+;B/+ +/+;+/+	A/+ ; +/+ A/A ; +/+ +/+ ; +/+	A/+ ; +/+ +/+ ; +/+
	+/+ ; +/+	A/+ ; B/+	A/+ ; B/+ +/+ ; B/+	+/+ ; B/+	A/+ ; B/+ A/+ ; +/+	A/+ ; +/+	+/+ ; B/+ +/+ ; +/+	A/+ ; B/+ A/+ ; +/+ +/+ ; B/+ +/+ ; +/+		+/+ ; +/+

2 Locus UDMEL 81 dihybrid punnet Square

Akbari\*, Matzen\*, Marshall\* et al. (2013) Curr. Biol.

Male

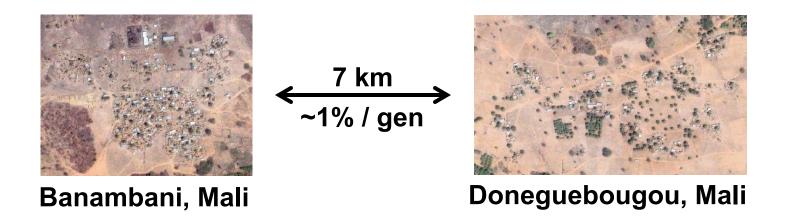
### **UDMEL** model fitted to laboratory drive experiments

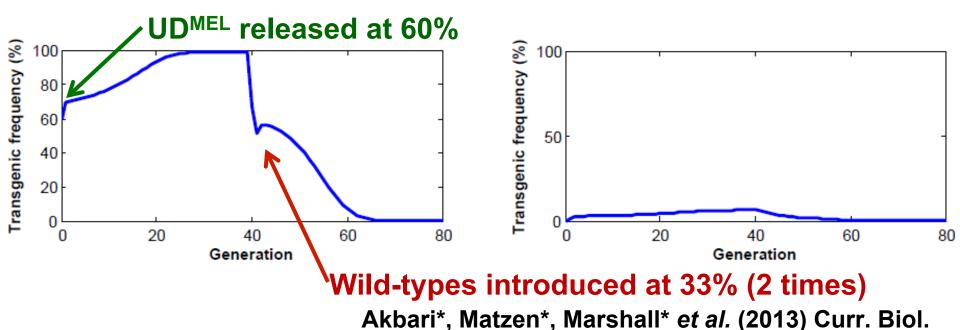


Construct has frequency-dependent fitness cost:

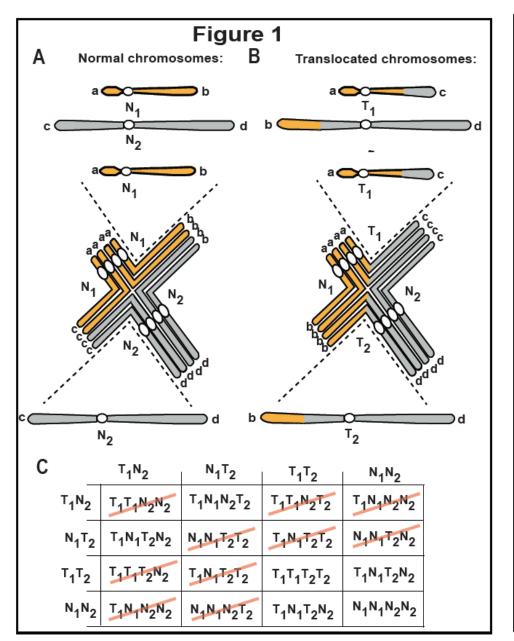
- 6% fitness benefit in fullywild-type pop.
- 21% fitness cost in fully transgenic pop.

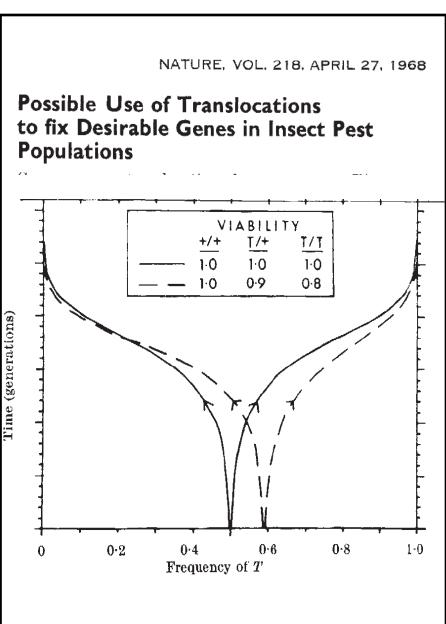
### Introduction of UD<sup>MEL</sup> is predicted to be confineable & reversible



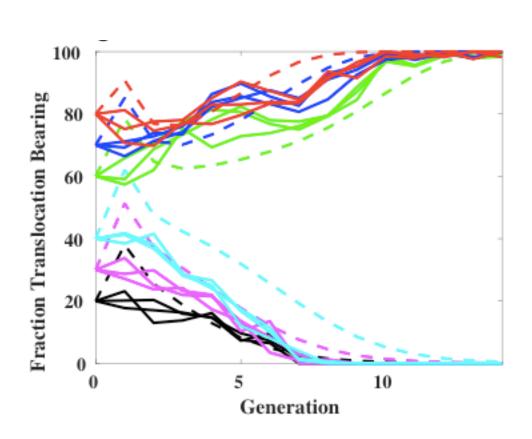


### Translocations display threshold-dependent dynamics





### Translocation model fitted to laboratory drive experiments



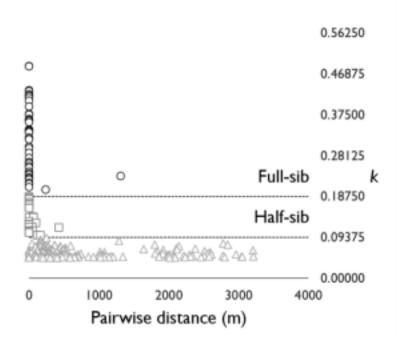
Translocation has timedependent fitness costs:

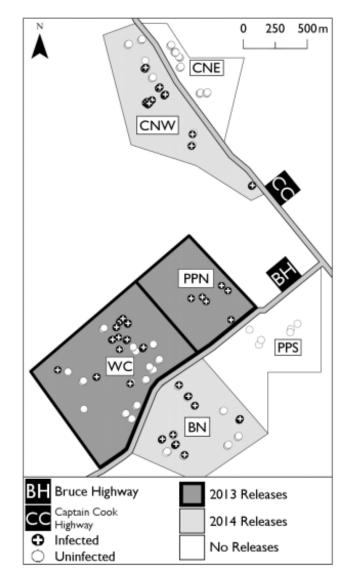
- Translocation homozygotes are initially very unfit; but rapidly increase in fitness in a couple of generations.
- Translocation heterozygotes have relatively consistent, near wild-type fitness.

Fine-scale landscape genomics of Aedes aegypti reveals loss of Wolbachia transinfection, dispersal barrier and potential for occasional long distance movement

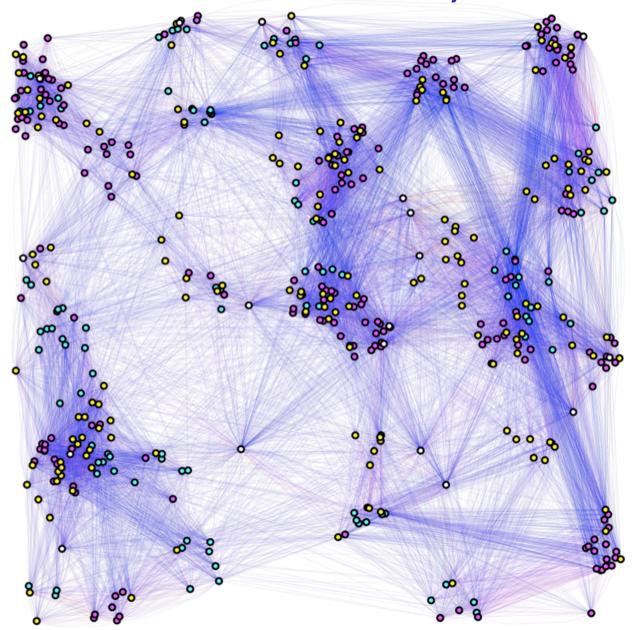
Thomas L Schmidt, Igor Filipovic, Ary A Hoffmann, Gordana Rasic

**Figure 3:** Loiselle's k estimates for sample pairs of relatedness k > 0.046875. Pairs of 0.09375 < k < 0.1875 are most likely half-sibs, those of k < 0.1875 are most likely full-sibs. Most related pairs were found within the same trap, but separation distances of up to 1312m were observed.



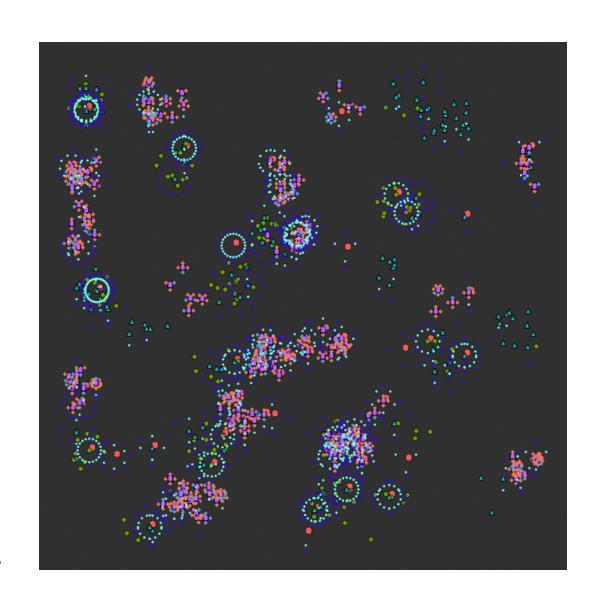


### MASH (Modular Analysis and Simulation for human Health)



### MASH (Modular Analysis and Simulation for human Health)

- Moving pink triangles are female mosquitoes
- Moving blue triangles are male mosquitoes
- Lines represent the trace of their movement
- Purple pentagons are blood-feeding sites
- Green circles are sugarfeeding sites
- Blue triangles are breeding sites/aquatic habitats
- Salmon hexagons are swarming/mating sites
- Blue/salmon diamonds around houses are susceptible and infectious humans



### Homing-based gene drive systems

The mutagenic chain reaction: A method for converting heterozygous to homozygous mutations

Valentino M. Gantz\* and Ethan Bier\*





# Highly efficient Cas9-mediated gene drive for population modification of the malaria vector mosquito *Anopheles stephensi*

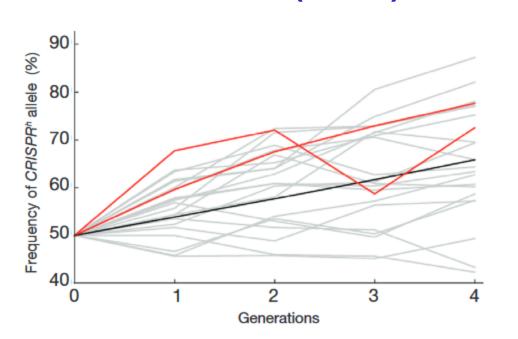
Valentino M. Gantz<sup>a,1</sup>, Nijole Jasinskiene<sup>b,1</sup>, Olga Tatarenkova<sup>b</sup>, Aniko Fazekas<sup>b</sup>, Vanessa M. Macias<sup>b</sup>, Ethan Bier<sup>a,2</sup>, and Anthony A. James<sup>b,c,2</sup>

### LETTERS

nature biotechnology

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

### Rate of resistant allele generation for Hammond et al. (2016) constructs



	Sequenced	Wild-type	Indel (independent)	Incomplete homing (independent)
AGAP011377	14	10	4 (3)	0
AGAP005958	13	5	8 (2)	0
AGAP007280	5	2	1 (1)	2 (1)

32 17 15

- Homing rate = 98%
  - Fertility of heterozygotes reduced by 90.7%
- Incomplete homing or indel events were observed in 15/32 screened organisms in which an error-free homing event was not observed.
- 1/7 of the homing events that originated these may be considered resistant alleles.
- Resistant allele generation rate = 0.13%

Hammond et al. (2016) Nature Biotech

### NHEJ is the most important source of homingresistant alleles

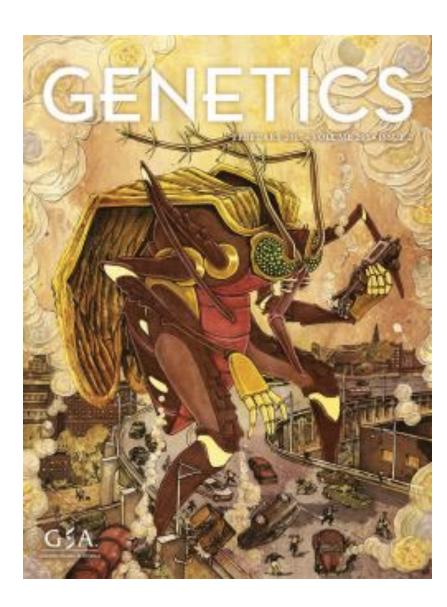
#### Evolution of resistance against CRISPR/Cas9 gene drive

Robert L. Unckless<sup>1</sup>, Andrew G. Clark<sup>2,3</sup>, Philipp W. Messer<sup>3,\*</sup>

- <sup>1</sup>Department of Molecular Biosciences, University of Kansas, Lawrence, KS
- <sup>2</sup>Department of Molecular Biology and Genetics, Cornell University, Ithaca, NY
- Department of Biological Statistics and Computational Biology, Cornell University, Ithaca, NY
- \*Corresponding author. Email: messer@cornell.edu

#### **ABSTRACT**

CRISPR/Cas9 gene drive (CGD) promises a highly adaptable approach for spreading genetically engineered alleles throughout a species, even if those alleles impair reproductive success. CGD has been shown to be effective in laboratory crosses of insects, yet it remains unclear to what extent potential resistance mechanisms will affect the dynamics of this process in large natural populations. Here we develop a comprehensive population genetic framework for modeling CGD dynamics, which incorporates potential resistance mechanisms as well as random genetic drift. Using this framework, we calculate the probability that resistance against CGD evolves from standing genetic variation, de novo mutation of wildtype alleles, or cleavage-repair by nonhomologous end joining (NHEJ) - a likely byproduct of CGD itself. We show that resistance to standard CGD approaches should evolve almost inevitably in most natural populations, unless repair of CGD-induced cleavage via NHEJ can be effectively suppressed, or resistance costs are on par with those of the driver. The key factor determining the probability that resistance evolves is the overall rate at which resistance alleles arise at the population level by mutation or NHEJ. By contrast, the conversion efficiency of the driver, its fitness cost, and its introduction frequency have only minor impact. Our results shed light on strategies that could facilitate the engineering of drivers with lower resistance potential, and motivate the possibility to embrace resistance as a possible mechanism for controlling a CGD approach. This study highlights the need for careful modeling of the population dynamics of CGD prior to the actual release of a driver construct into the wild.



### emale

### Modeling error-prone homing-based gene drive

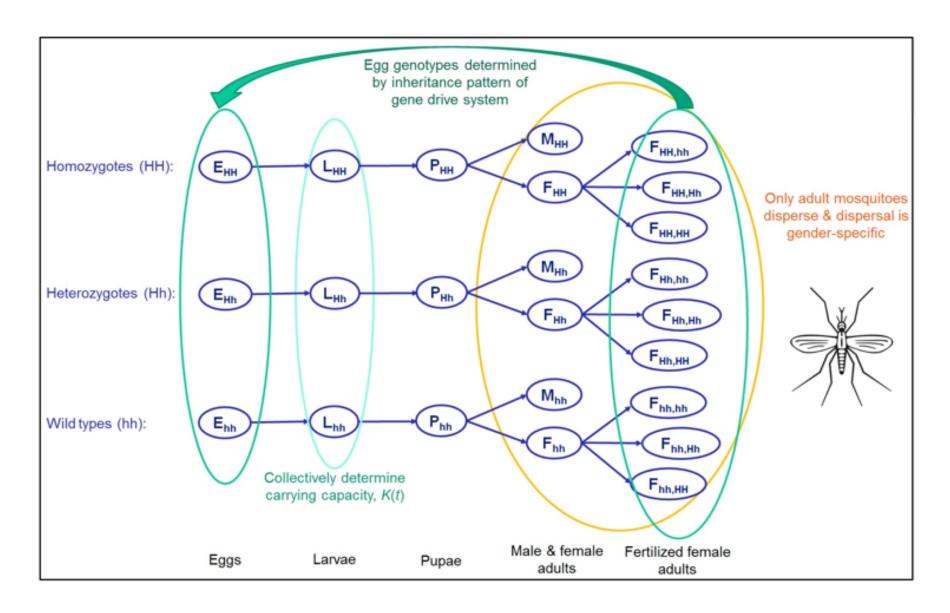
#### Male

	нн	Hh	HR	hh	hR	RR
НН	1 HH	((1+e)/2) HH ((1-e-ρ)/2) Hh (ρ/2) HR	(1/2) HH (1/2) HR	(1) Hh	(1/2) Hh (1/2) HR	(1) HR
Hh	((1+e)/2ρ) HH ((1-e-ρ)/2) Hh (ρ/2) HR	Cross A	Cross B	((1+e)/2) Hh ((1-e-ρ)/2) hh (ρ/2) hR	Cross D	((1+e)/2) HR ((1-e-ρ)/2) hR (ρ/2) RR
HR	(1/2) HH (1/2) HR	Cross C	(1/4) HH (1/2) HR (1/4) RR	(1/2) Hh (1/2) hR	(1/4) Hh (1/4) HR (1/4) hR (1/4) RR	(1/2) HR (1/2) RR
hh	(1) Hh	((1+e)/2) Hh ((1-e-ρ)/2) hh (ρ/2) HR	(1/2) Hh (1/2) hR	(1) hh	(1/2) hR (1/2) hh	(1) hR
hR	(1/2) Hh (1/2) HR	Cross E	(1/4) Hh (1/4) HR (1/4) hR (1/4) RR	(1/2) hR (1/2) hh	(1/4) hh (1/2) hR (1/4) RR	(1/2) hR (1/2) RR
RR	(1) HR	((1+e)/2) HR ((1-e-ρ)/2) hR (ρ/2) RR	(1/2) HR (1/2) RR	(1) hR	(1/2) hR (1/2) RR	(1) RR

Cross A  $(((1+e)^2)/4) \text{ HH} \qquad (((1-e-\rho)^2)/4) \text{ hh} \\ (((1+e)(1-e-\rho))/2) \text{ Hh} \ (((1-e-\rho)\rho)/2) \text{ hR} \\ (((1+e)\rho)/2) \text{ HR} \qquad ((\rho^2)/4) \text{ HR}$ 

Cross B/C ((1+e)/4) HH ((1-e-ρ)/4) hR ((1-e-ρ)/4) Hh ((ρ)/4) RR ((1+e+ρ)/4) HR Cross D/E
((1+e)/4) Hh ((1-e-ρ)/4) hh
((1+e)/4) HR ((1-e)/4) hR
((ρ)/4) RR

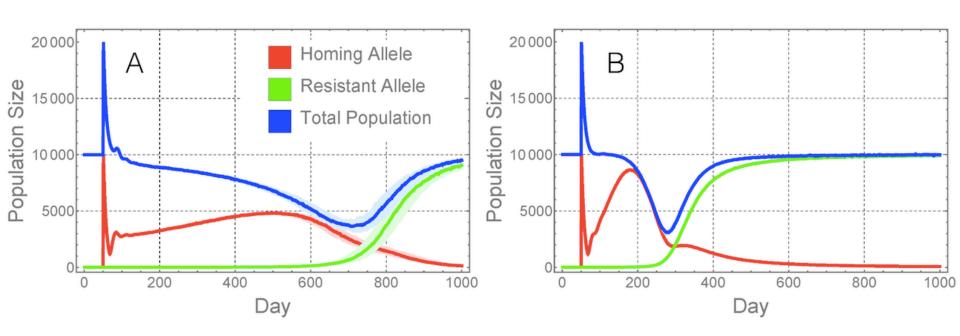
### Population dynamic model (with overlapping generations, density-dependence, stochasticity)



### **Dynamics of current constructs**

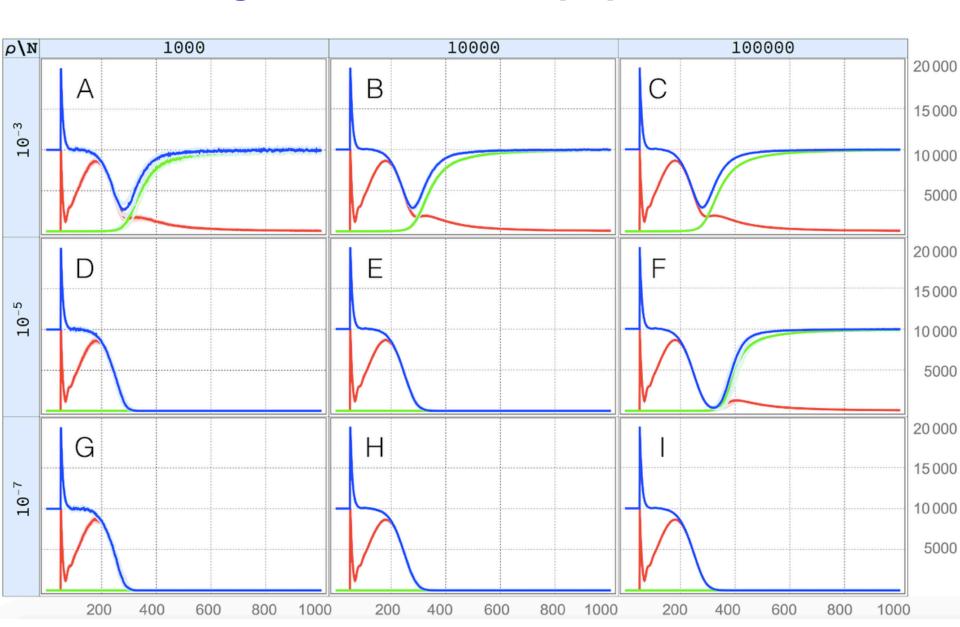
- a) Hammond *et al.* (2016) construct:
  - Homing rate = 98%
  - NHEJ rate = 0.13%
  - Fertility of heterozygotes reduced by 90.7%

- b) Hammond *et al.* (2016) construct:
  - Homing rate = 98%
  - NHEJ rate = 0.13%
  - Fertility of heterozygotes same as wild-type

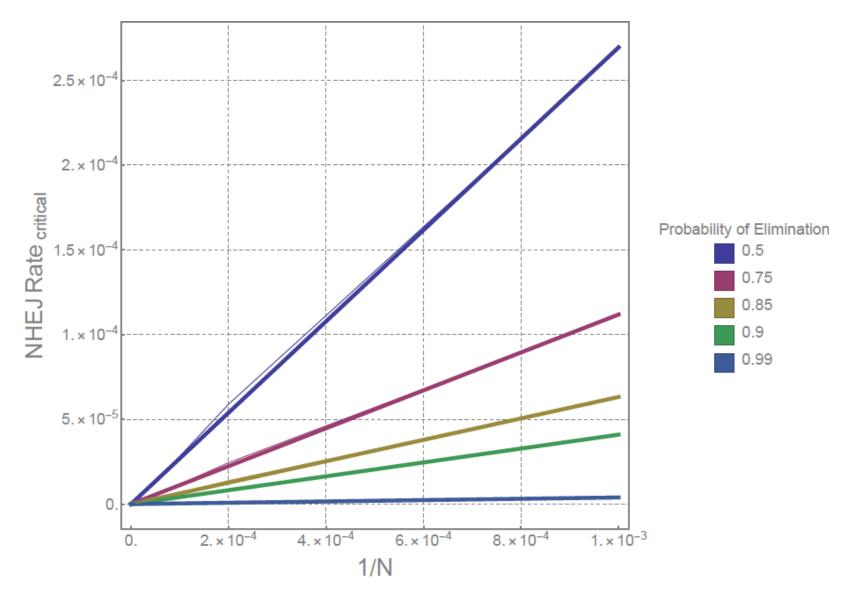


Marshall, Buchman, Sanchez & Akbari (2016) bioRxiv

### Population elimination depends on the resistant allele generation rate & population size

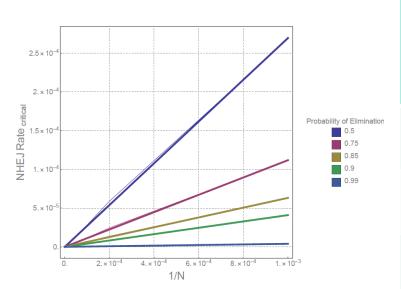


### Tolerable rates of resistant allele generation are inversely proportional to the population size



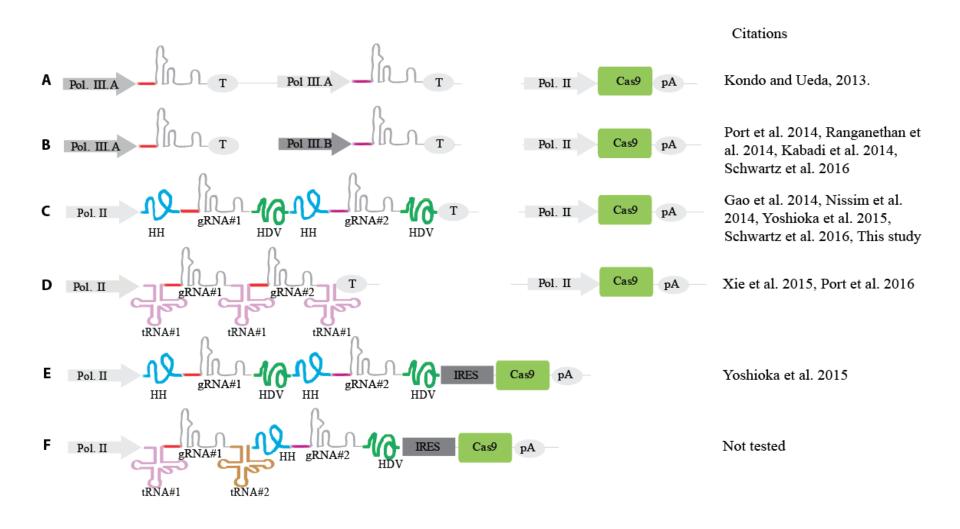
Marshall, Buchman, Sanchez & Akbari (2016) bioRxiv

### So the resistant-allele generation rate we need to achieve is...



Population size ( <i>N</i> ):	Homing-resistant allele generation rate for 90% probability of elimination:
1 thousand	4 x 10 <sup>-5</sup>
1 million	4 x 10 <sup>-8</sup>
1 billion	4 x 10 <sup>-11</sup>
10 billion	4 x 10 <sup>-12</sup>

### Multiplexing gRNAs



Marshall, Buchman, Sanchez & Akbari (2016) bioRxiv

### Population elimination possible through multiplexing

$$\rho_{m=2} = \frac{P\{hh\}}{P\{hh\} + P\{hR\}} \rho^2 + \frac{P\{hR\}}{P\{hh\} + P\{hR\}} \rho \qquad \rho_{m=2} \approx \rho^2$$

$$P\{hh\} + P\{hR\} = \frac{P\{hh\}}{P\{hh\} + P\{hR\}} \rho \qquad \rho_{m=2} \approx \rho^2$$

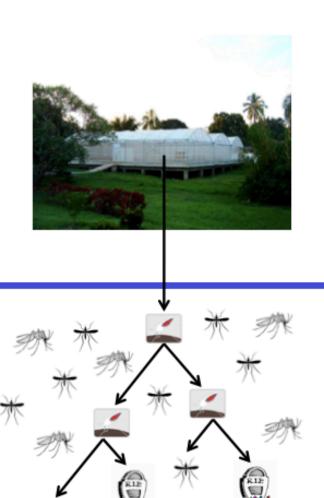
$$\rho_{m=3} = \frac{P\{hhh\}\rho^{3} + P\{hhR\}\rho^{2} + P\{hRR\}\rho}{P\{hhh\} + P\{hhR\} + P\{hRR\}} \qquad \rho_{m=3} \approx \rho^{3}$$

Multiplex number:	Homing- resistant allele generation rate:	Population size capable of eliminating:
1	1.3 x 10 <sup>-3</sup>	32
2	1.7 x 10 <sup>-6</sup>	24 thousand
3	2.2 x 10 <sup>-9</sup>	19 million
4	2.9 x 10 <sup>-12</sup>	14 billion

Marshall, Buchman, Sanchez & Akbari (2016) bioRxiv

### The effect of gene drive on containment of transgenic mosquitoes John M. Marshall\*

Department of Biomathematics, UCLA School of Medicine, University of California at Los Angeles, Los Angeles, CA 90095-1766, USA



- Prior to a release, trials are required in outdoor field cages.
- Some breaches of containment are difficult to protect against.
- Gene drive systems enhance the invasiveness of introduced genes.
- Question #1: "How likely is it that gene drive systems will persist following an accidental release?"

#### Branching process:

- A small number of GM mosquitoes escape into an infinite population of wild-types.
- Mating and death of GM mosquitoes is modeled in continuous time.
- Patterns of inheritance are specific to each gene drive system.

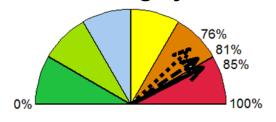
Marshall (2009) J Theor Biol

### Homing-based systems are highly invasive following an accidental release

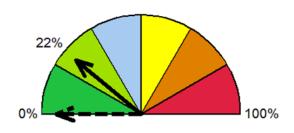
- Homing-based systems are more likely to spread than not for releases > 5
- Toxin-antidote systems like
   Medea are unlikely to spread
   because their drive only
   becomes significant at higher
   population frequencies
- Threshold-dependent systems are unlikely to spread following an accidental release

Persistence probability following an accidental release of 10 GM mosquitoes:

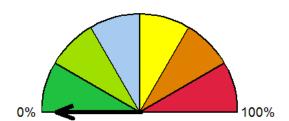
#### **HEGs / homing systems:**

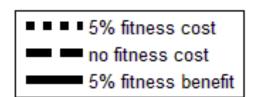


#### Medea:

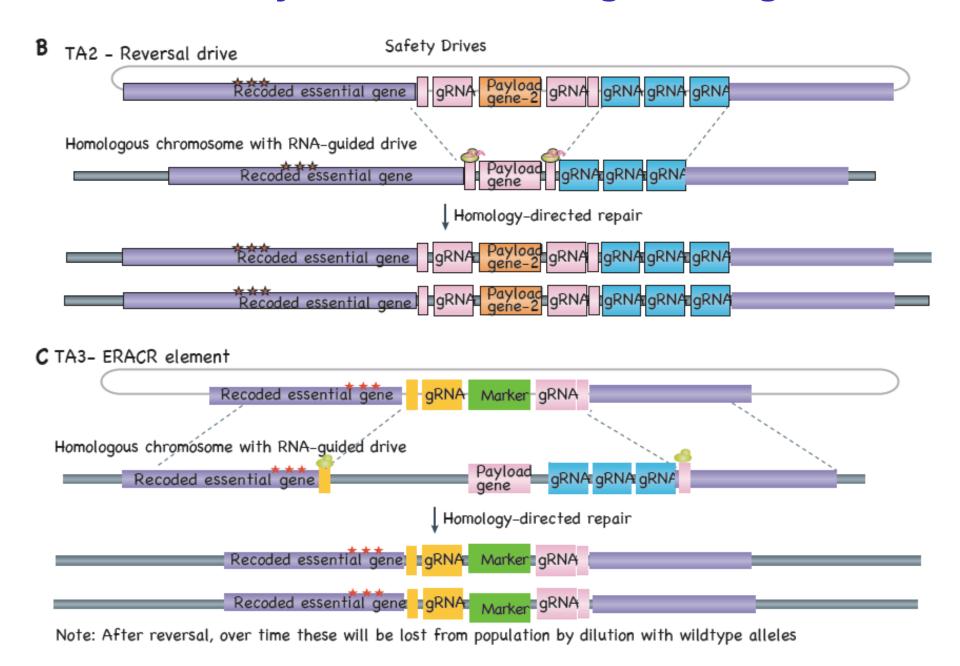


#### **Underdominance:**

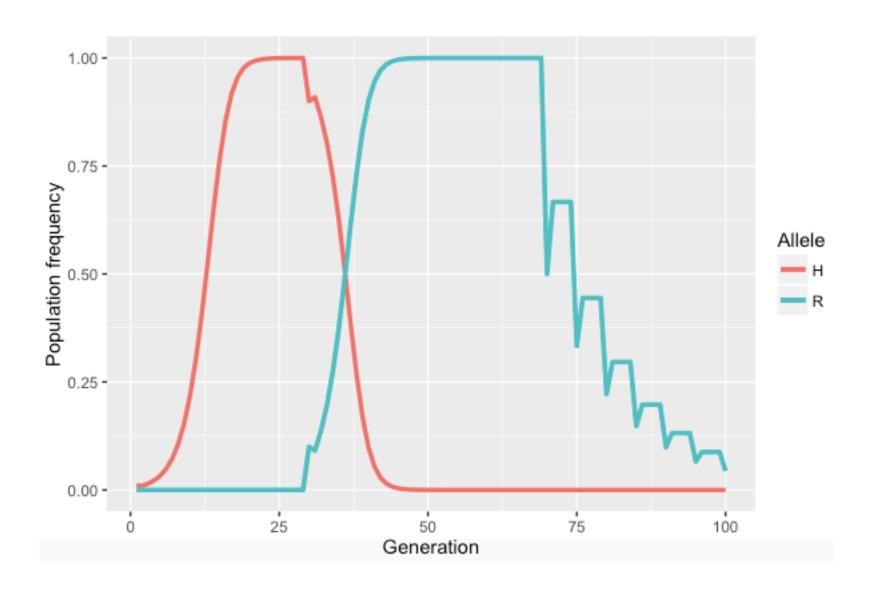




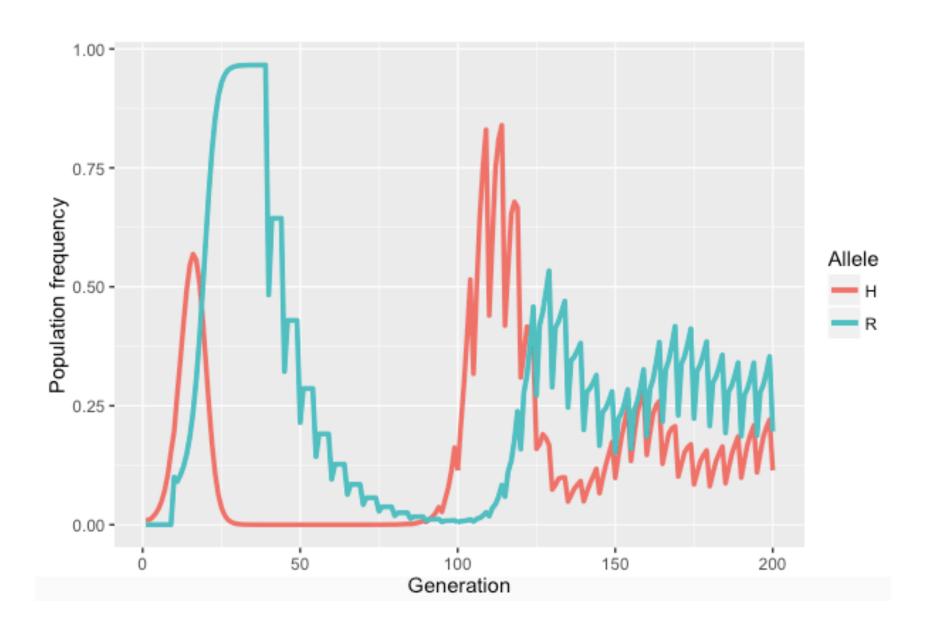
### Remediation systems for homing-based gene drive



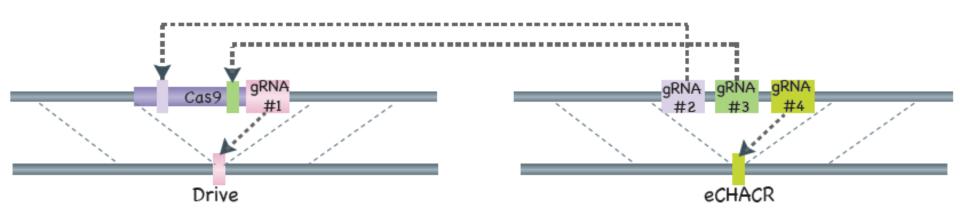
### **Drive (red) + Reversal drive or ERACR (turquoise)**



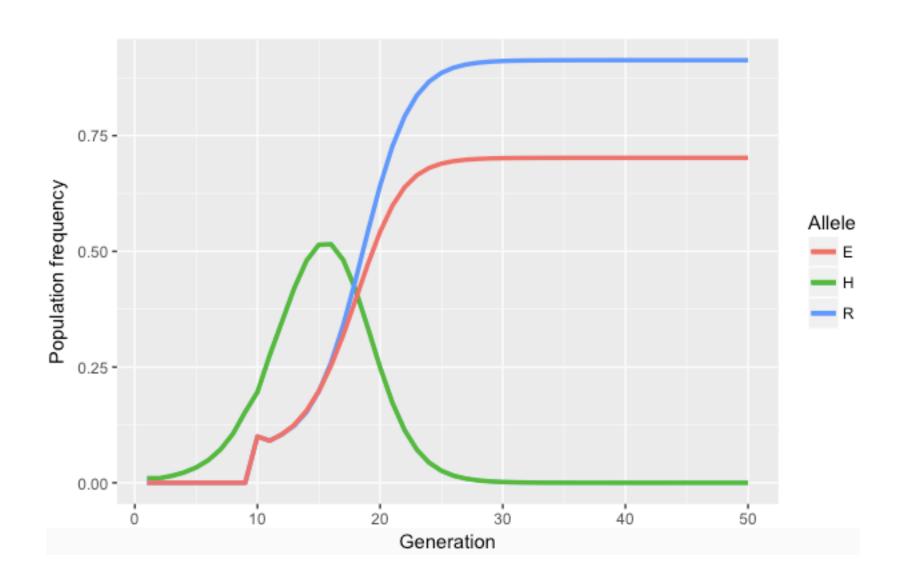
### Longer-term reversal & dilution dynamics



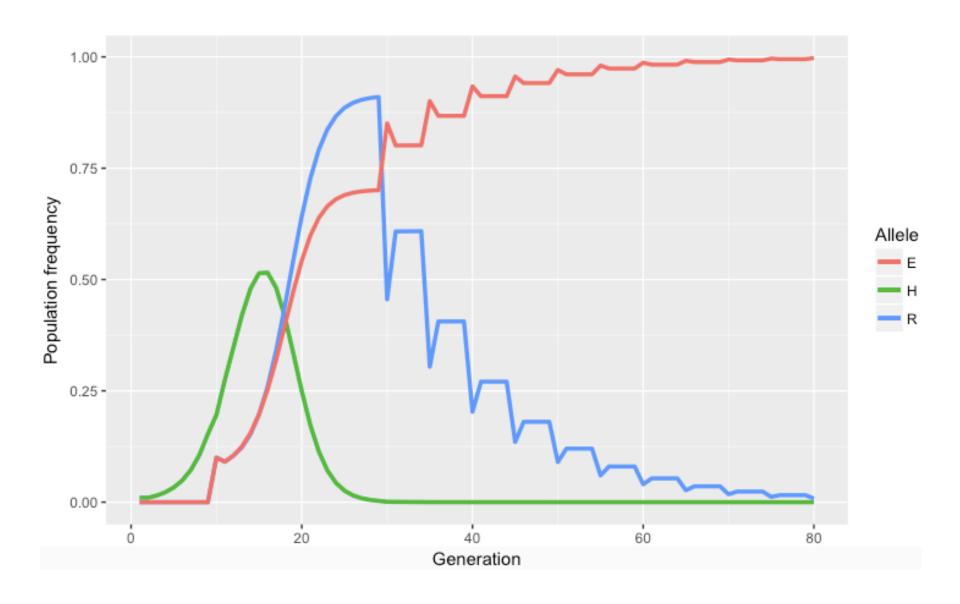
### eCHACR & other reversal systems



### Drive (red), Resistant allele (blue) + eCHACR (green)



### Dilution dynamics retaining eCHACR allele



### **Conclusions**

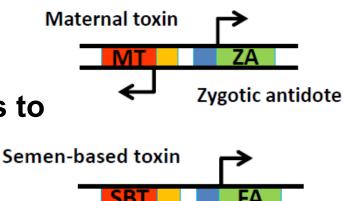
### **Homing-based systems:**

- 1. Multiplexing provides a solution to resistant allele generation
- 2. Homing systems are highly invasive
- 3. Remediation strategies need to be explored in structured populations

# Step 1 Cutting Cutting Step 2 HEG Repair Homing HEG

#### **Toxin-antidote-based systems:**

- 1. Recent success in engineering threshold-dependent systems
- 2. Impact of population structure needs to be explored
- 3. Strange fitness effects, etc. need to be explored in wild populations



Female antidote

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RESEARCH Open Access

# Perspectives of people in Mali toward genetically-modified mosquitoes for malaria control

John M Marshall\*1, Mahamoudou B Touré<sup>2</sup>, Mohamed M Traore<sup>2</sup>, Shannon Famenini<sup>3,4</sup> and Charles E Taylor<sup>3,4</sup>



 Public attitude surveys in Mali suggest that people would like to see a successful confined trial before accepting a release:

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

72-year-old man, Tienfala, Mali