



**USAID**  
FROM THE AMERICAN PEOPLE

## May Adaptation Community Meeting

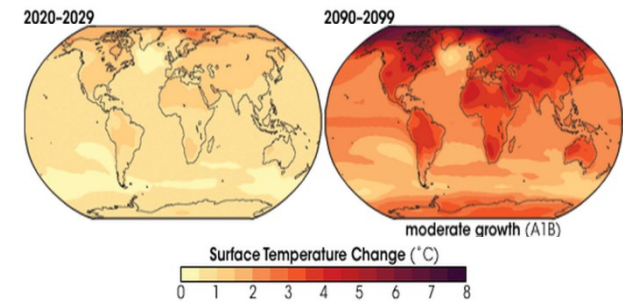
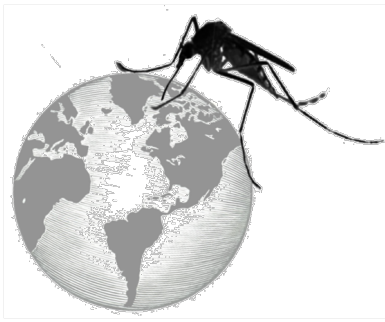
### Shifting Burdens of Malaria in a Hotter Africa: A Framework for Planning and Intervention

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May 16, 2019

**ATLAS**  
Adaptation Thought Leadership and Assessments





# Shifting burdens of malaria in Africa under climate change: a framework for planning and intervention

Sadie J. Ryan



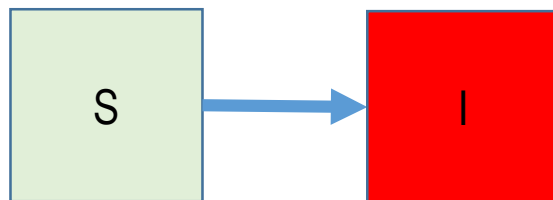
# Today's menu

- Introduction to a physiological model for malaria
- Mapping malaria transmission and season
- Adding climate change in Africa & ATLAS project
- Informing interventions

## The model continuum

Mechanistic process

Bottom up



$$dS/dt = -bSI$$

$$dI/dt = bSI$$

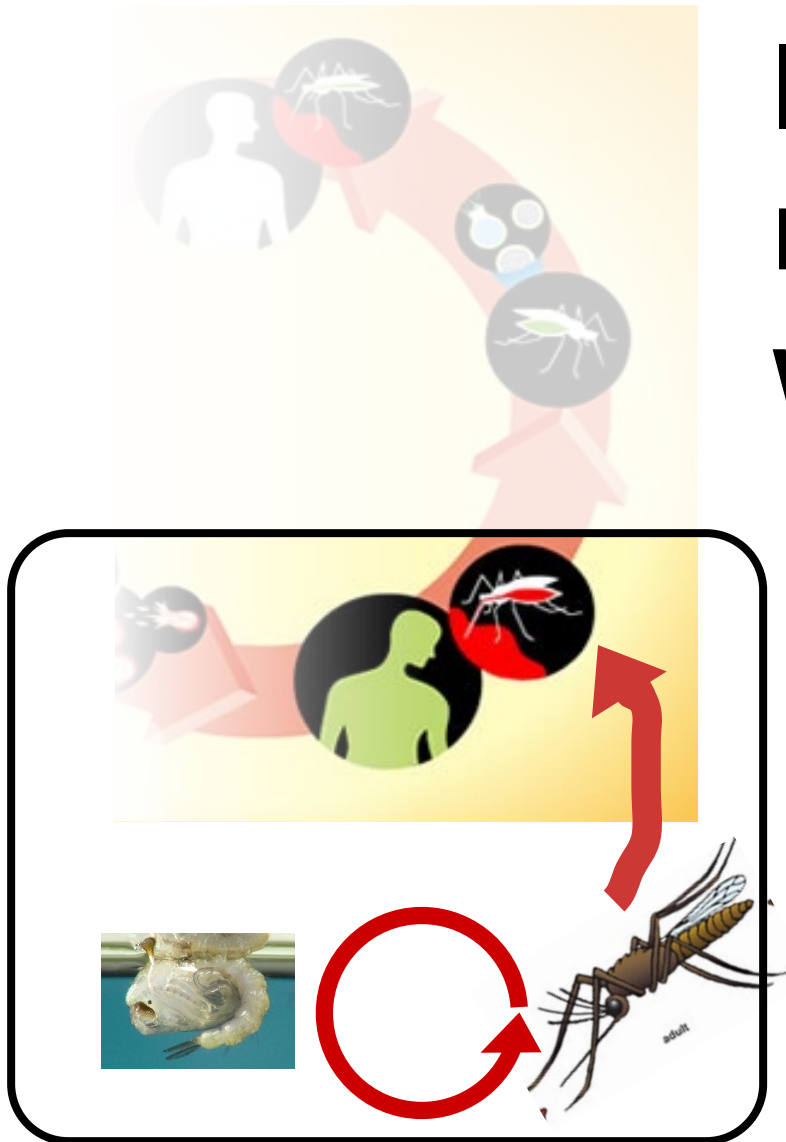
Pattern finding – stats

Top down

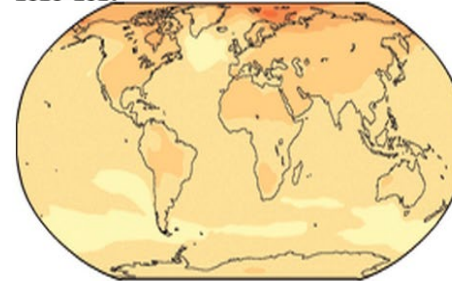
```
Mod <- lmer (x ~  
  fever + age + NDVI + temp +  
  1|state)
```



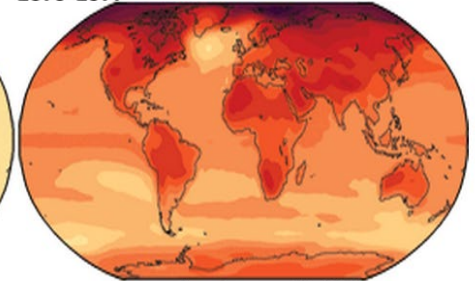
# Is a warmer world necessarily a sicker world?



2020-2029



2090-2099

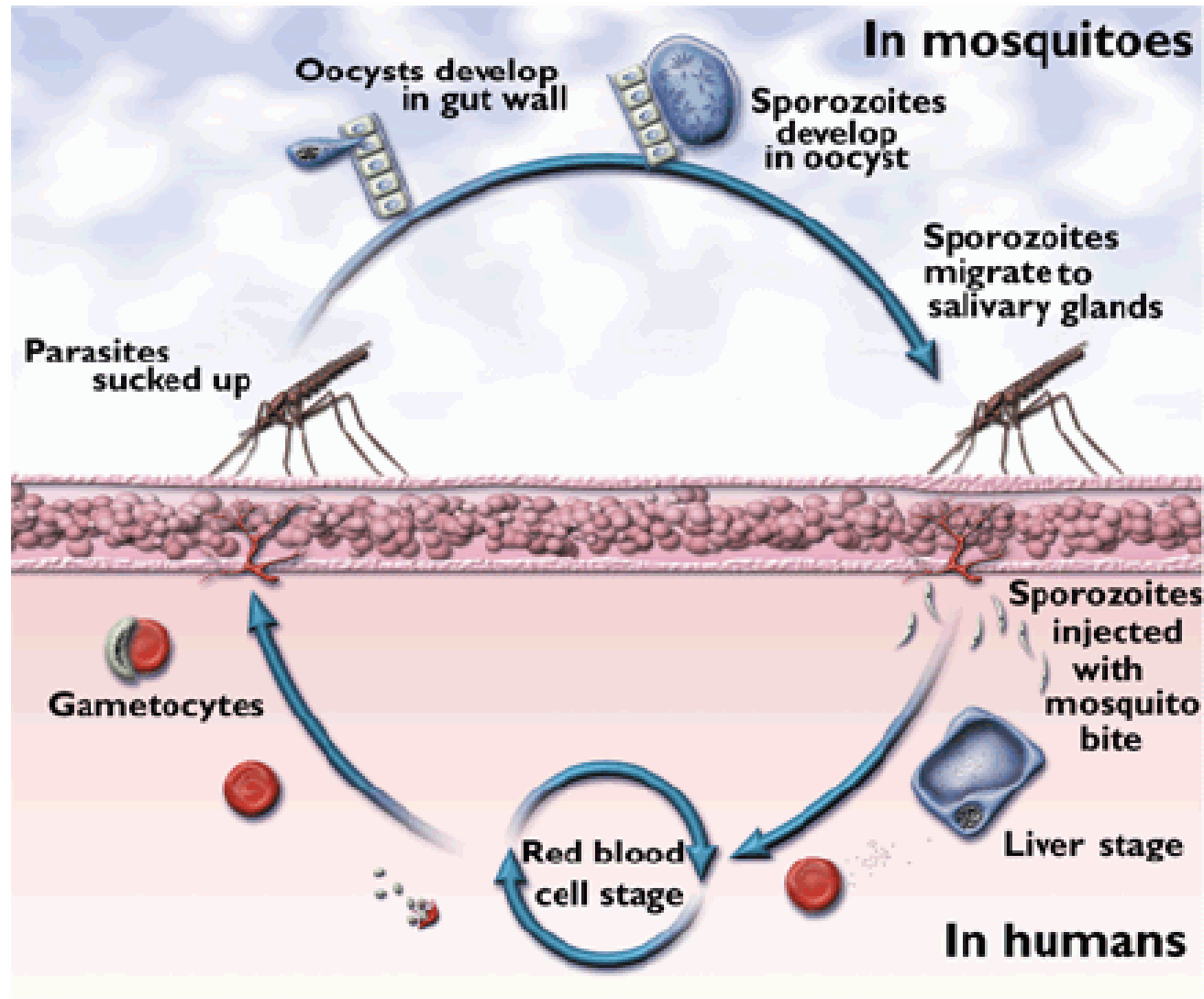


moderate growth (A1B)

Surface Temperature Change ( $^{\circ}\text{C}$ )



# How does malaria respond to temperature?



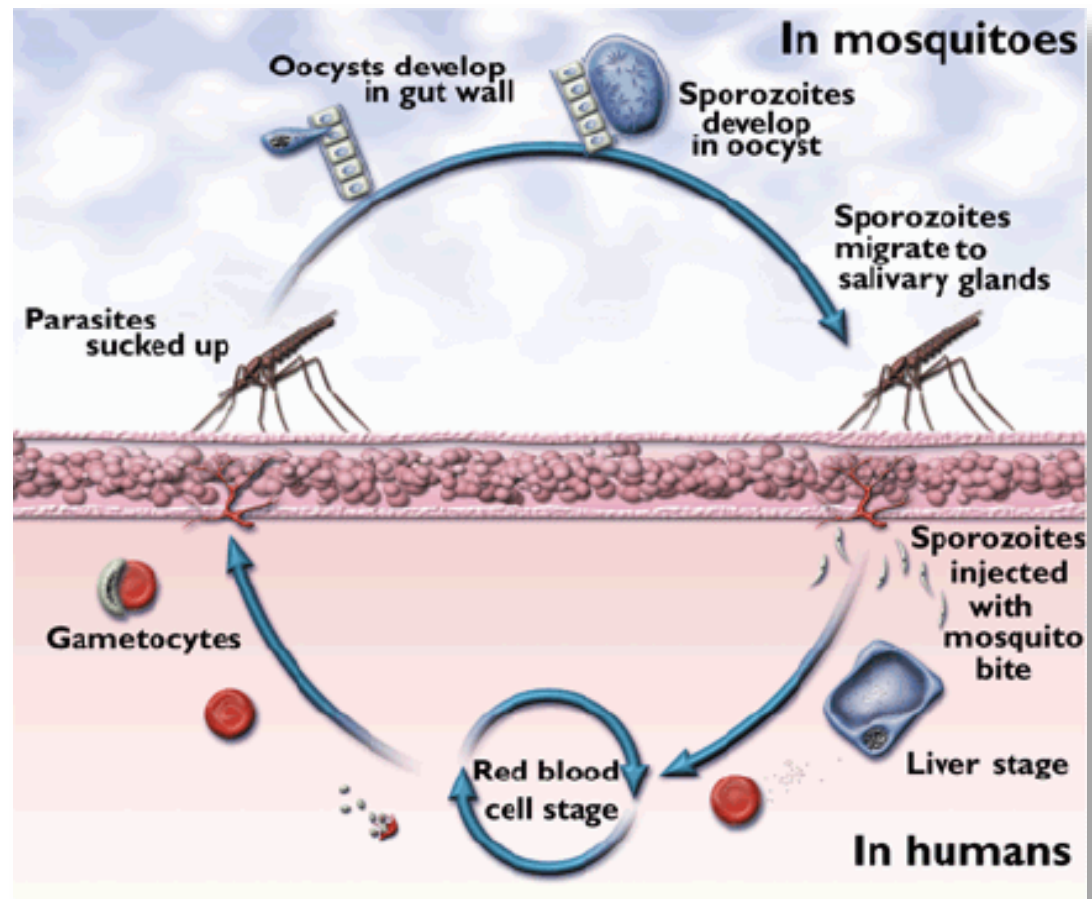
# How does malaria respond to temperature?

## What Processes Drive Malaria Transmission?

$$R_0 = \sqrt{\frac{ma^2bp^{EIP}}{-r \ln(p)}}$$

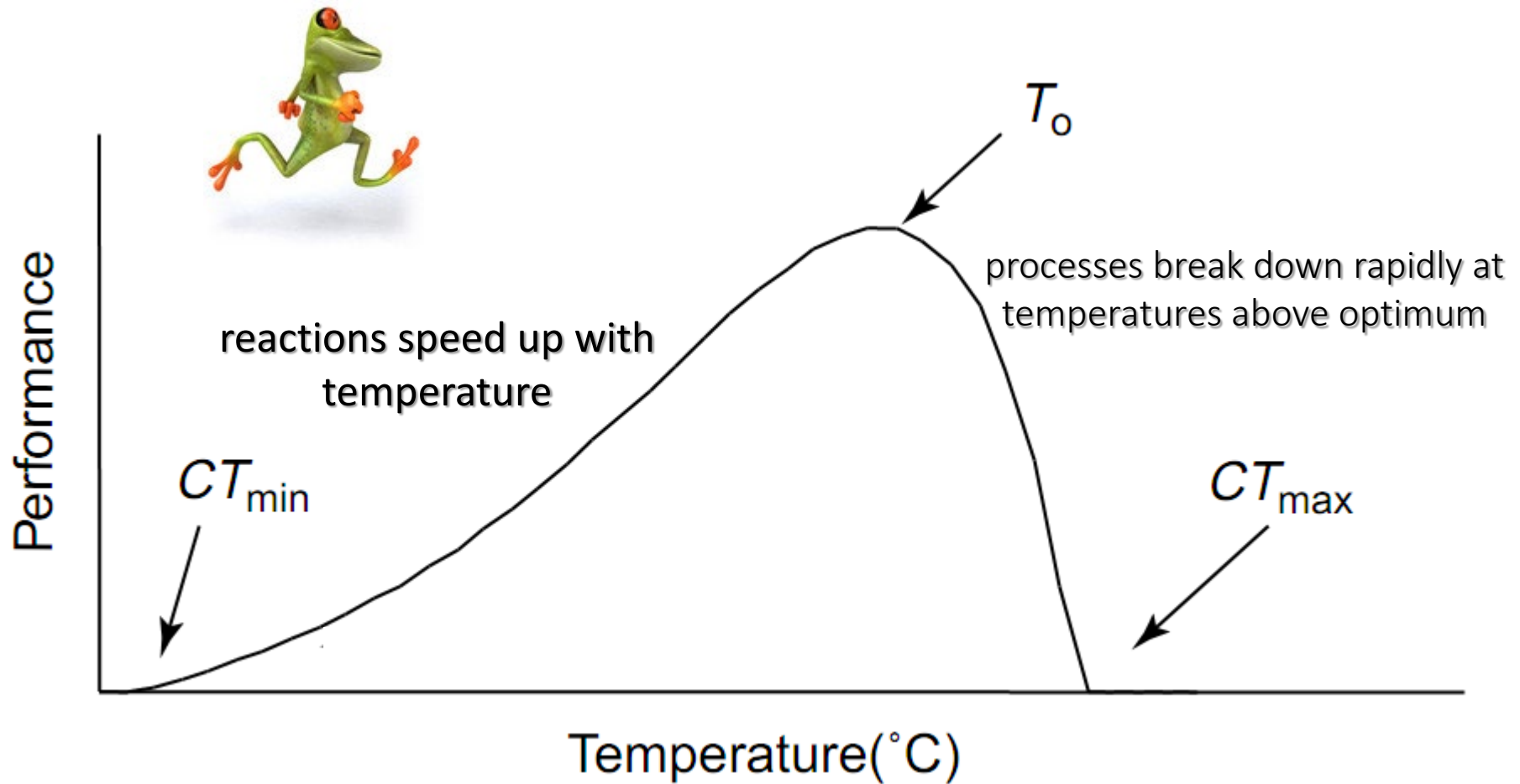
MacDonald (1957)

- ❖ mosquito density ( $m$ )
- ❖ mosquito biting rate ( $a$ )
- ❖ infectiousness of infected mosquitoes ( $b$ )
- ❖ vector survival ( $p$ )
- ❖ human recovery rate ( $r$ )

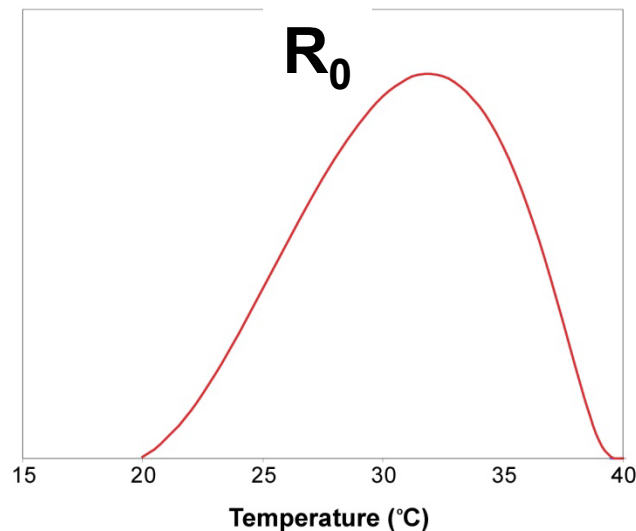
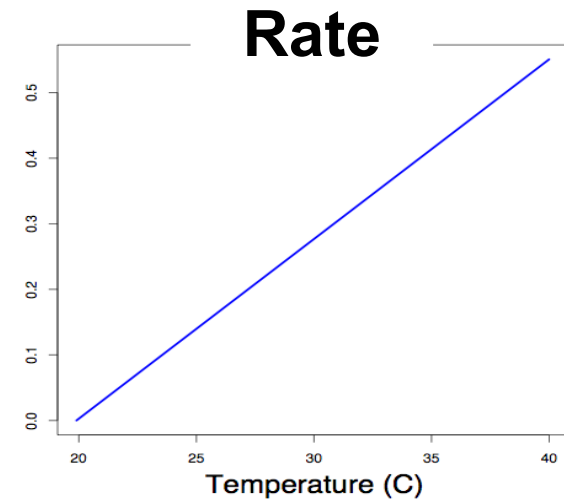
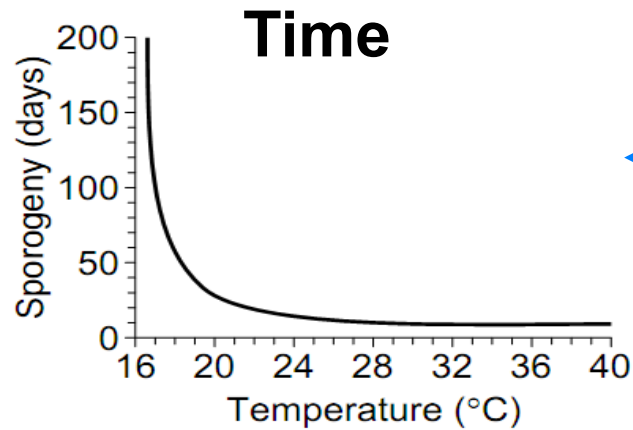




# How Does Temperature Drive Biological Processes?



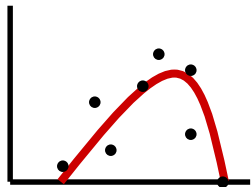
# Previous malaria models: linear or constant rates



opposing effects of temperature  
on parasite development and  
mosquito survival

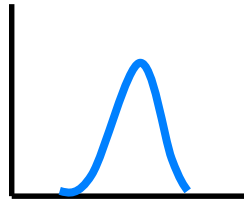
# Our approach

**Fit physiological responses with data**



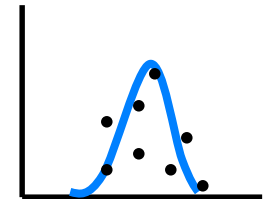
symmetric & asymmetric,  
linear (for comparison)

**Calculate  $R_0$  vs.  $T$**

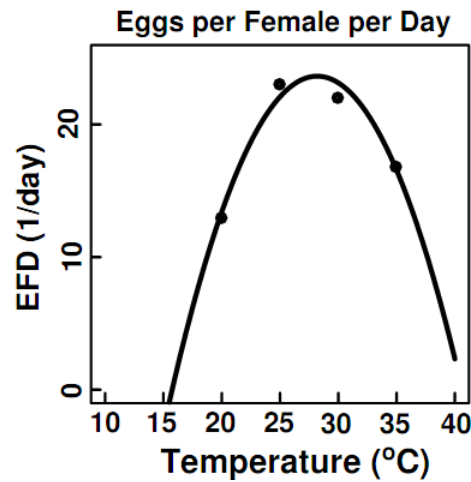
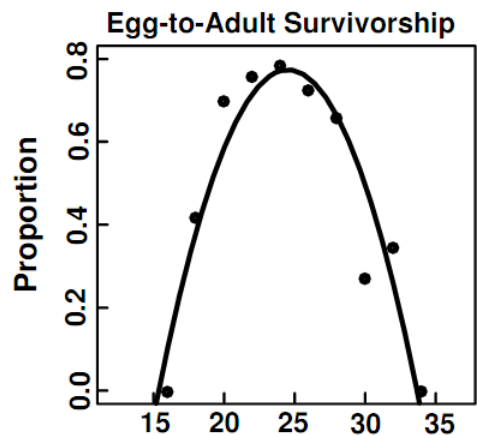
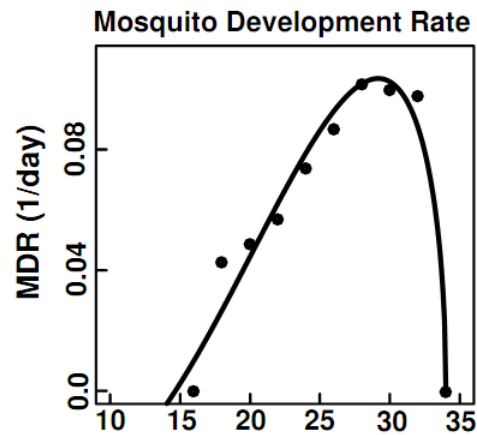
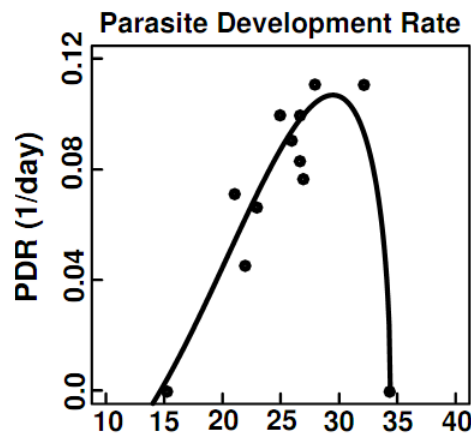
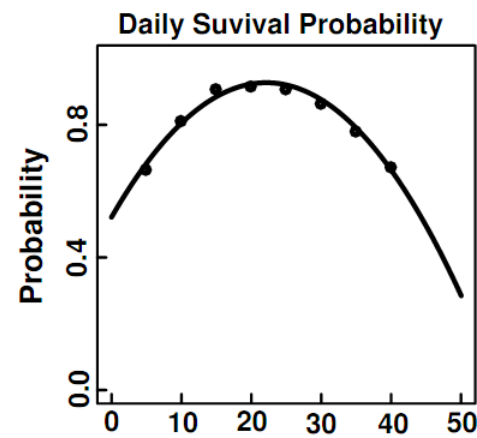
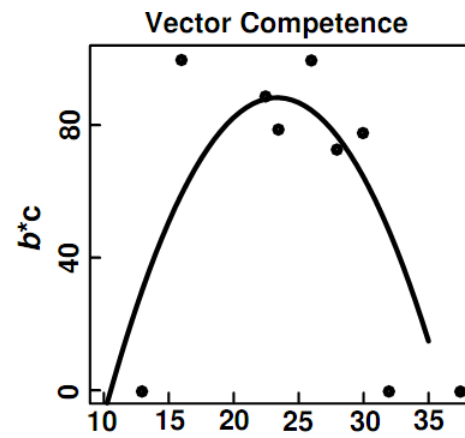
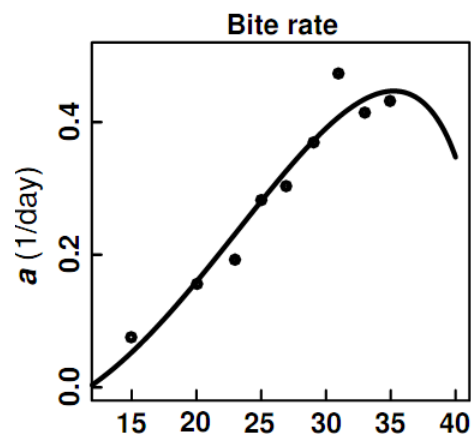


$$R_0 = \sqrt{\frac{a^2 bc m p^T}{(-\ln p)r}}$$

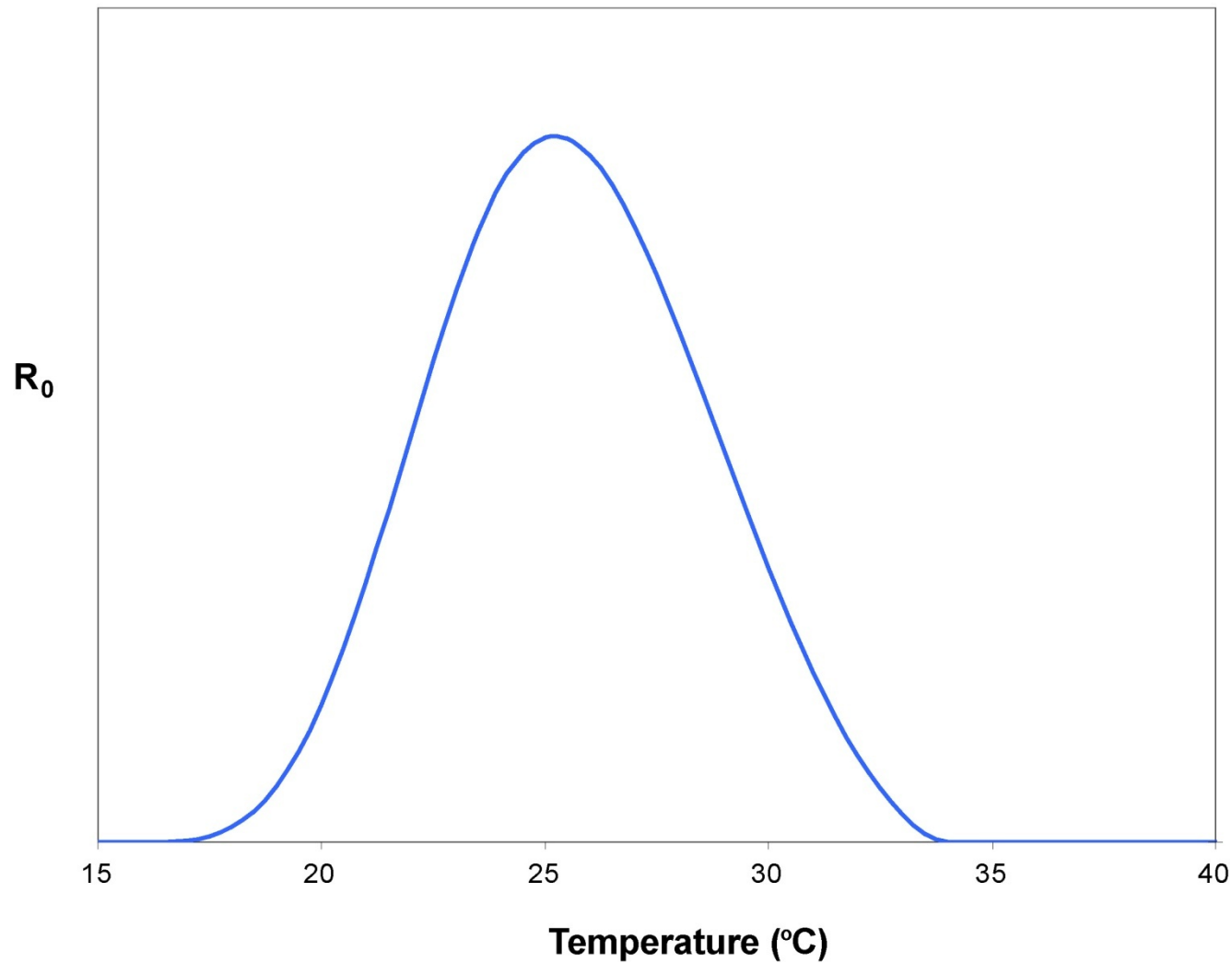
**Validate with field data**



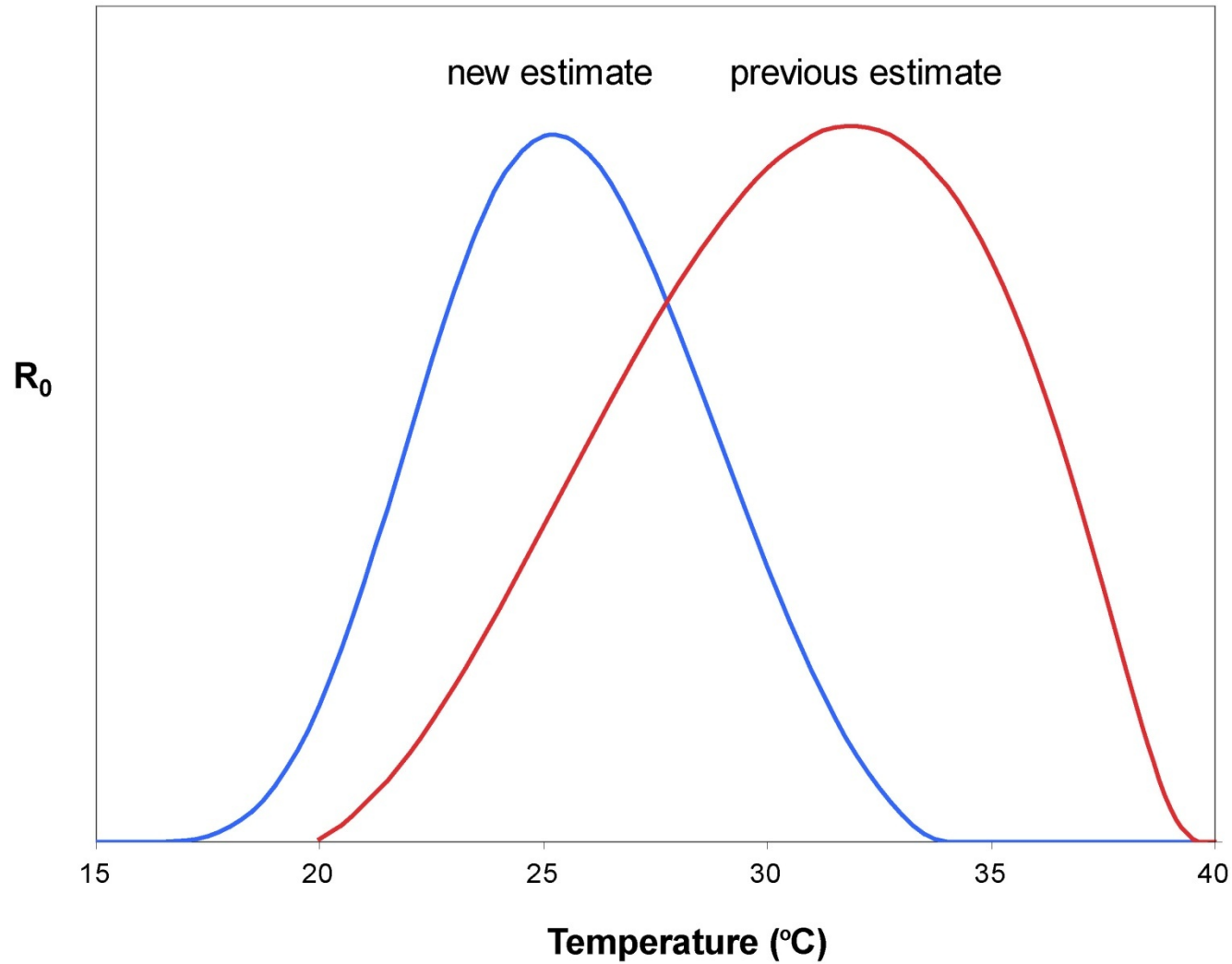




# $R_0$ vs. Temperature

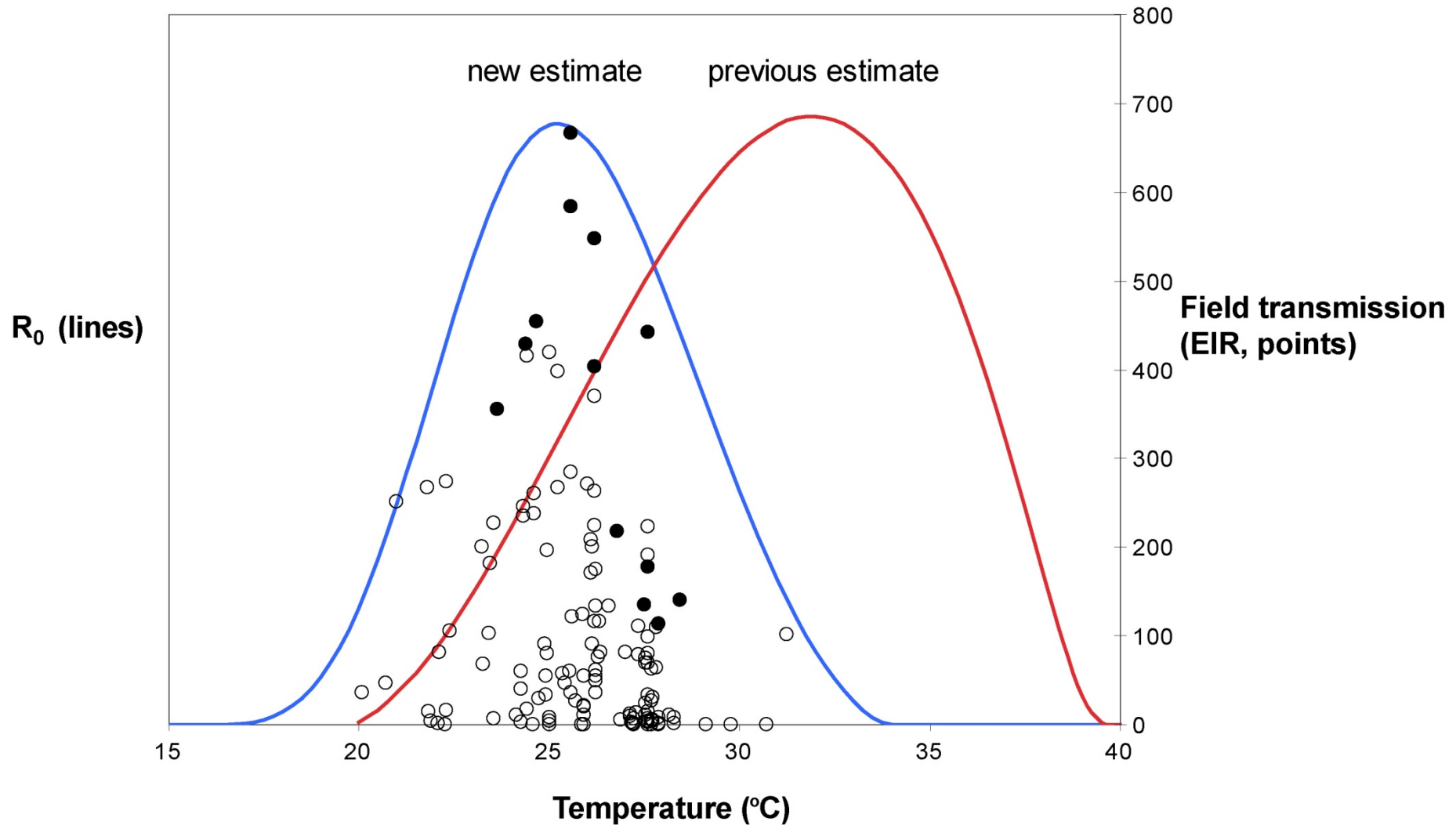


# 6°C cooler





# Matches field data



Field data from MARA project and ERA-40 project

## LETTER

## Optimal temperature for malaria transmission is dramatically lower than previously predicted

Erin A. Mordecai,<sup>1,\*</sup> Krijn P. Paaijmans,<sup>2</sup> Leah R. Johnson,<sup>3</sup> Christian Balzer,<sup>1,†</sup> Tal Ben-Horin,<sup>4</sup> Emilyde Moor,<sup>5</sup> Amy McNally,<sup>5</sup> Samraat Pawar,<sup>6</sup> Sadie J. Ryan,<sup>7</sup> Thomas C. Smith<sup>1</sup> and Kevin D. Lafferty<sup>1,8</sup>

### Abstract

The ecology of mosquito vectors and malaria parasites affect the incidence, seasonal transmission and geographical range of malaria. Most malaria models to date assume constant or linear responses of mosquito and parasite life-history traits to temperature, predicting optimal transmission at 31 °C. These models are at odds with field observations of transmission dating back nearly a century. We build a model with more realistic ecological assumptions about the thermal physiology of insects. Our model, which includes empirically derived nonlinear thermal responses, predicts optimal malaria transmission at 25 °C (6 °C lower than previous models). Moreover, the model predicts that transmission decreases dramatically at temperatures > 28 °C, altering predictions about how climate change will affect malaria. A large data set on malaria transmission risk in Africa validates both the 25 °C optimum and the decline above 28 °C. Using these more accurate nonlinear thermal-response models will aid in understanding the effects of current and future temperature regimes on disease transmission.

### Keywords

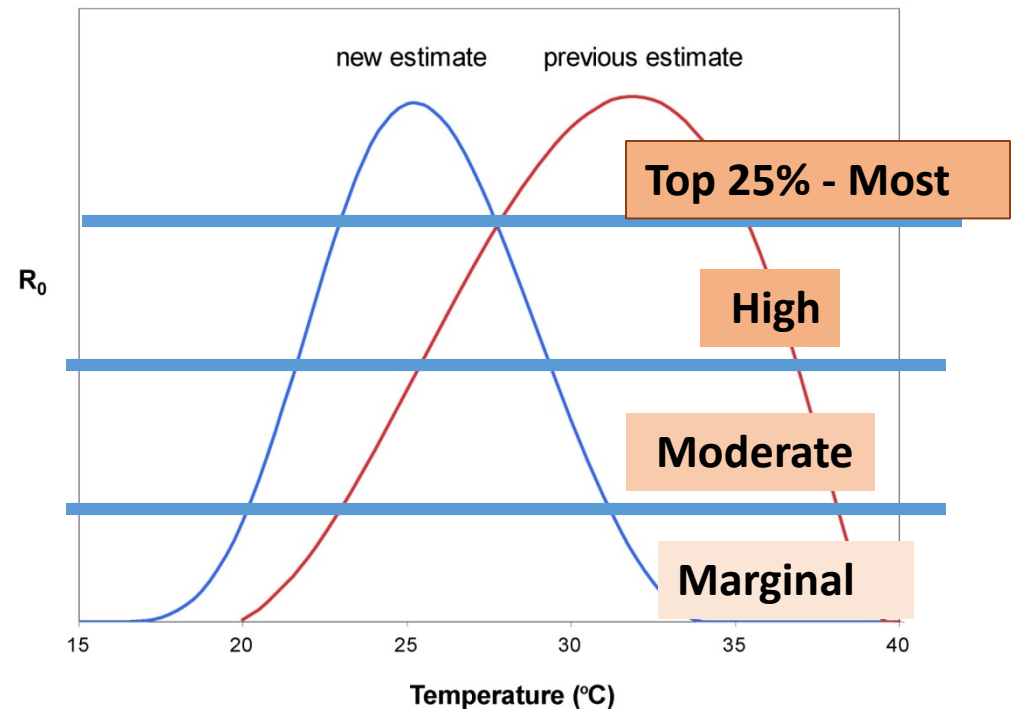
*Anopheles*, climate change, disease ecology, malaria, *Plasmodium falciparum*, temperature.

*Ecology Letters* (2012)

# How do we tell people?

## People like maps

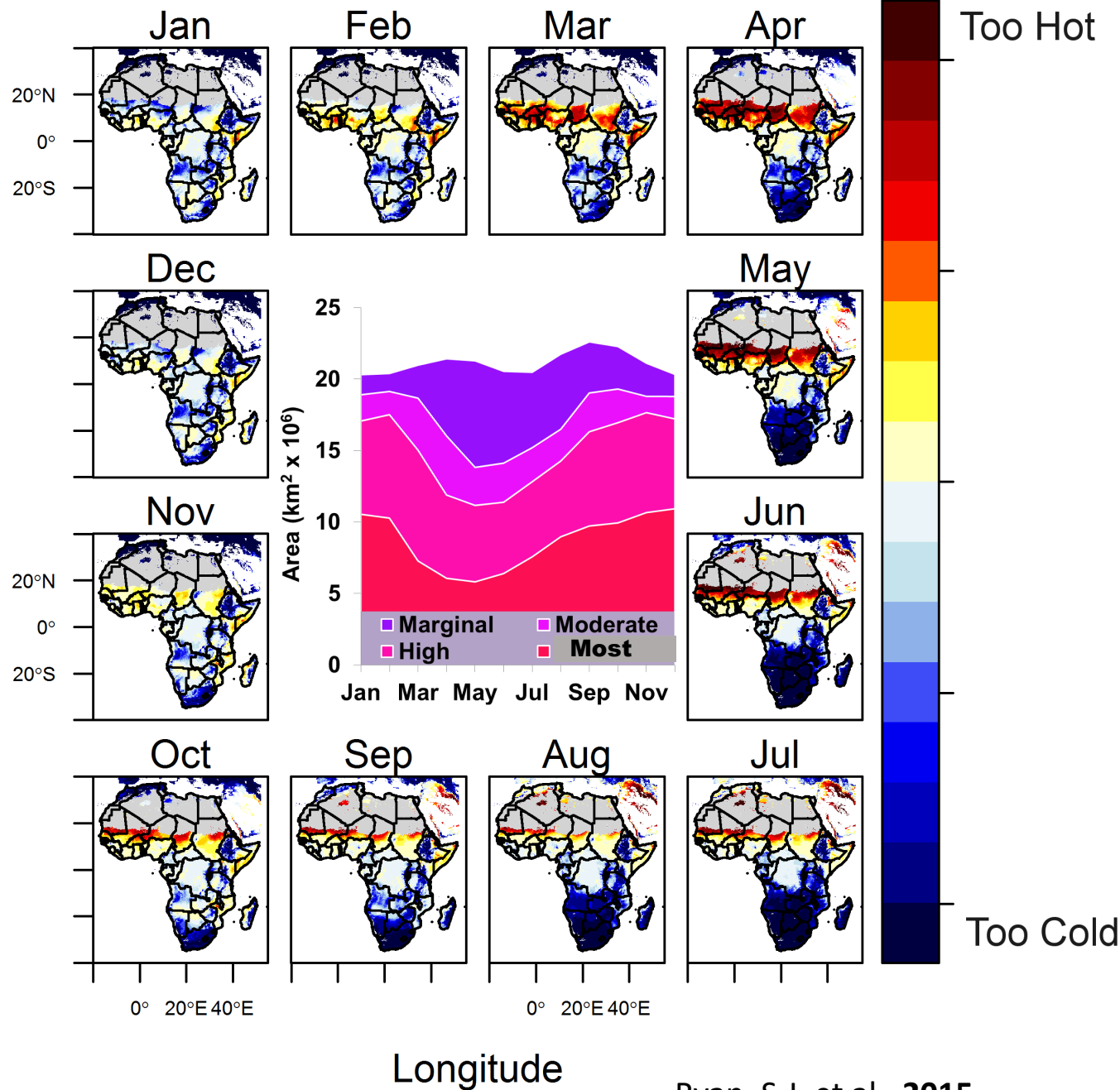
- The question of “where” is very important for control
- Prevention for travelers
- Anticipating shifts of transmissibility and seasons



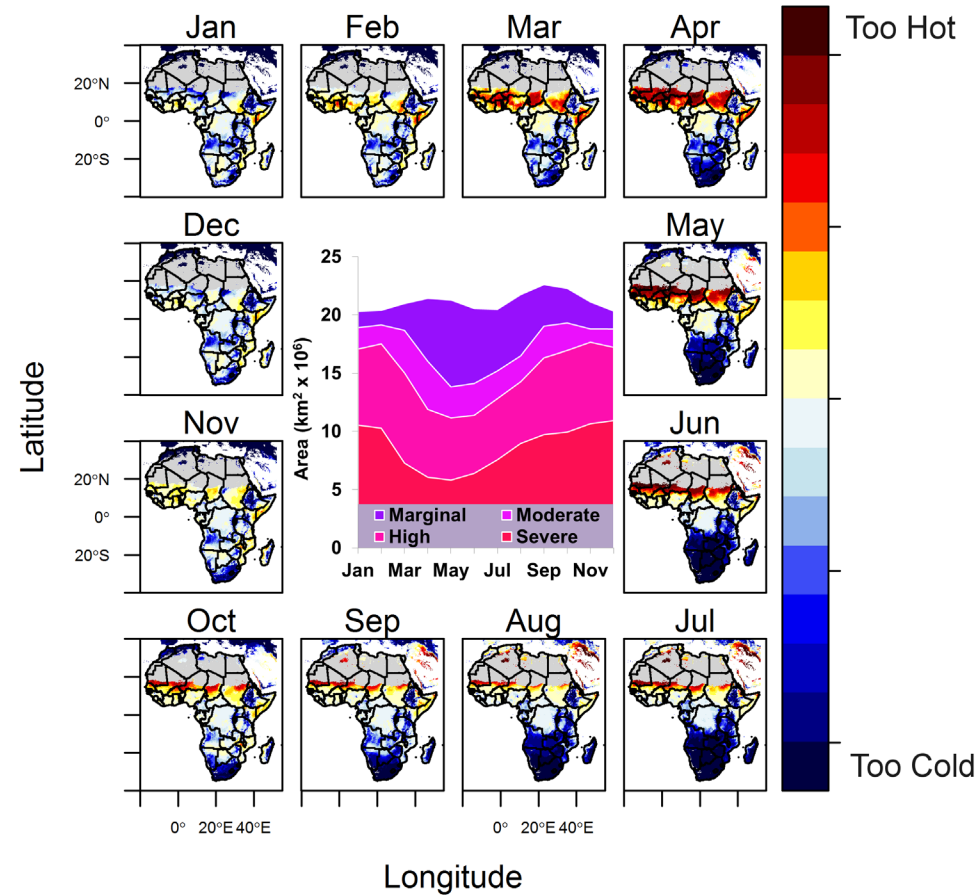
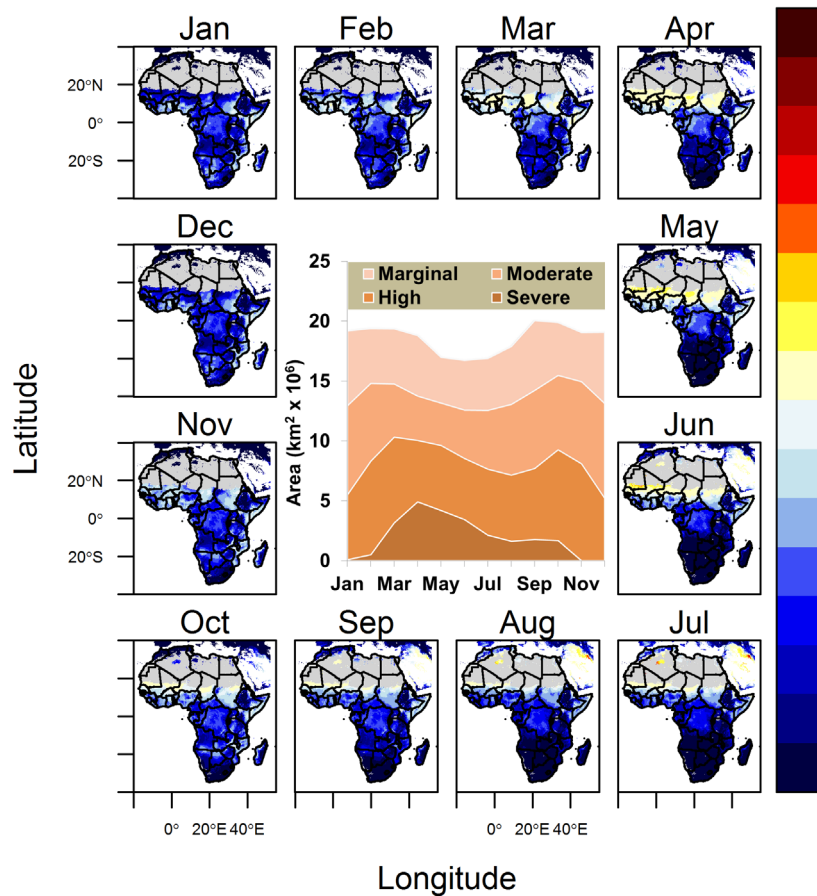
WorldClim data  
Temperature  
Agg: 10km<sup>2</sup>

Aridity mask  
MODIS NDVI

Latitude

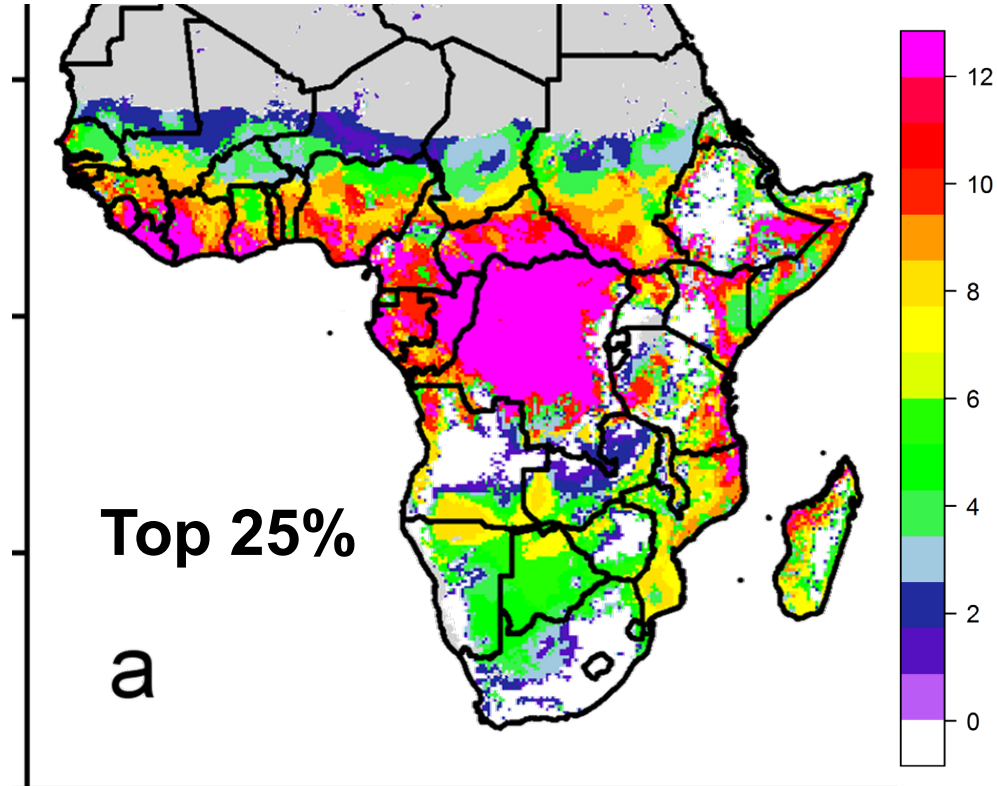
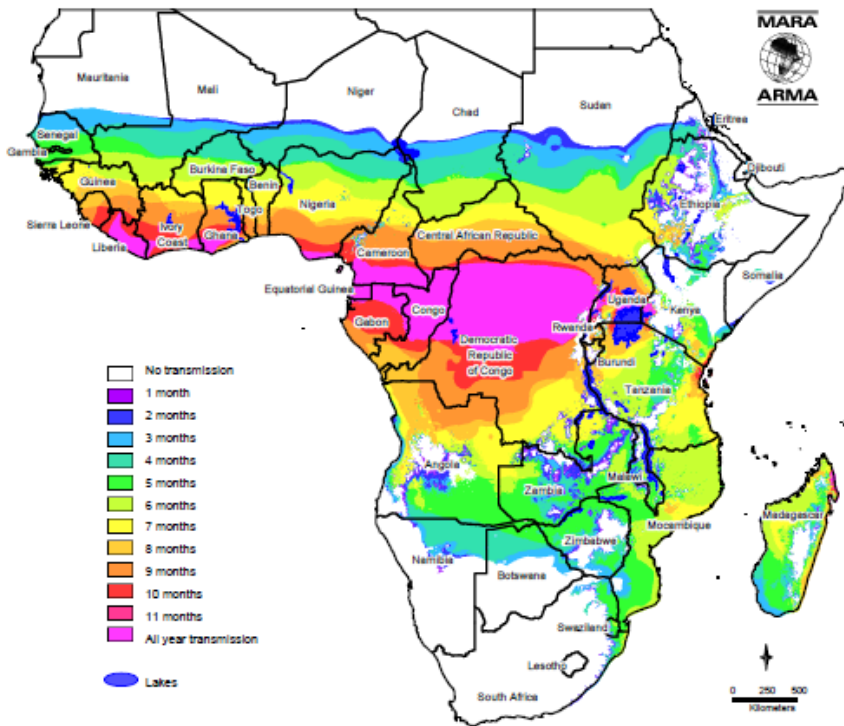


# Old and New



# Seasonality – duration of season

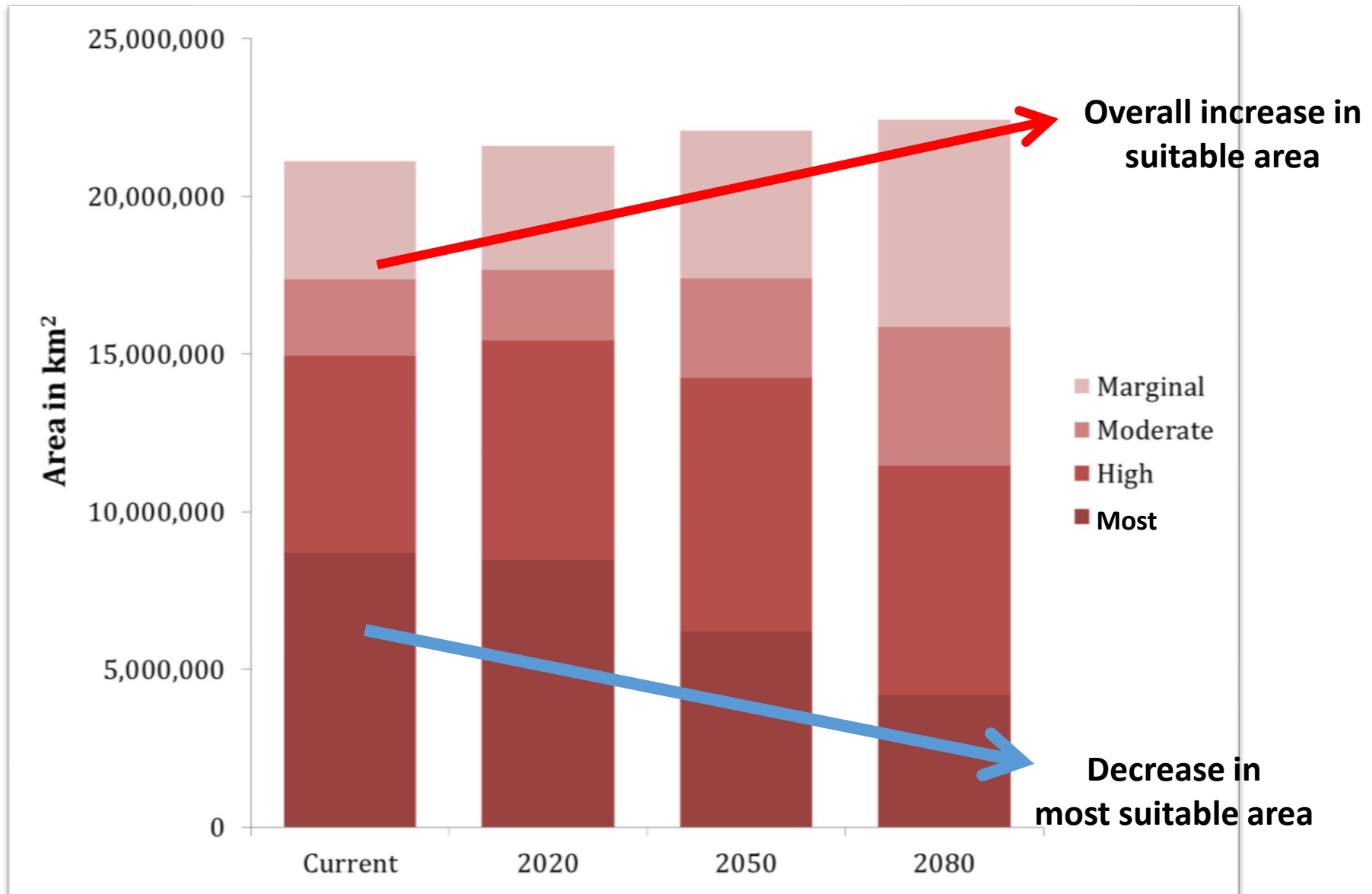
Duration of the Malaria Transmission Season



***Maps are useful for planning and intervention***

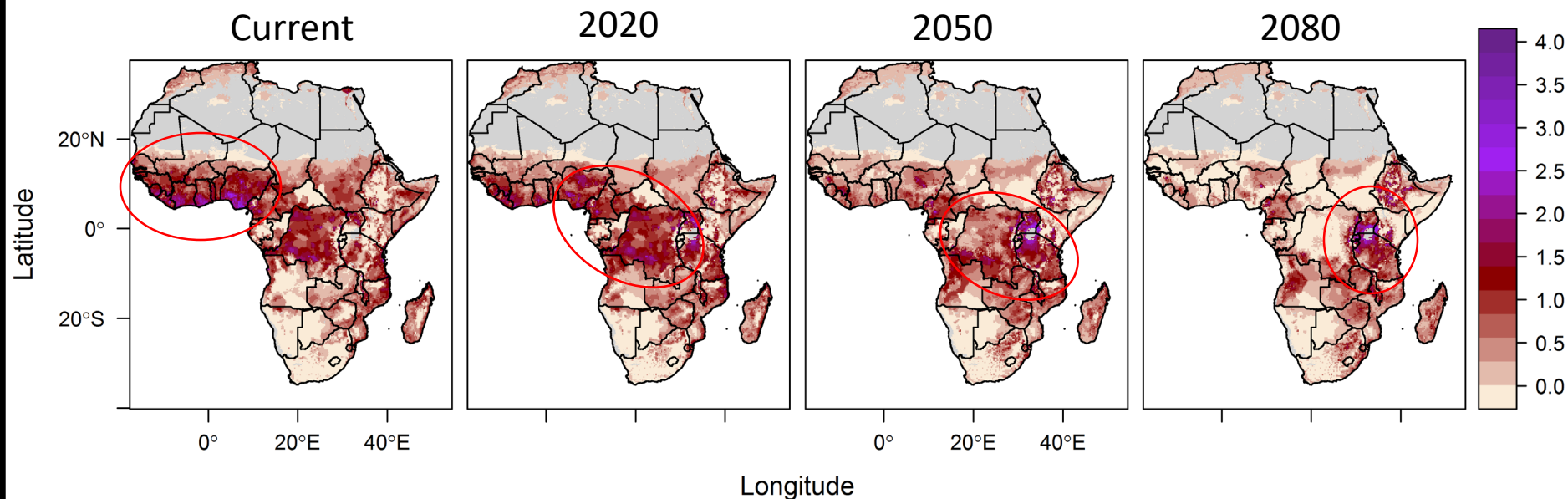


# Warm it up – scenario A1B



Ryan, S.J. et al., 2015

# ***Risk – population and suitability***



*Population density estimates for 2015 \* severe suitability quantile under HadCM3*

News / Health

## Researchers Consider Climate Change Impact on Public Health

Print Comment (2) Share:



Carol Pearson  
December 10, 2015 10:20 PM

Tweet

Recommend Share 114

G+ 0

Pin it

### RELATED ARTICLES

- WHO Calls for Public Health Agenda at Paris Climate Talks

WASHINGTON—U.S. health agencies have been monitoring [climate change](#) for some time. So have researchers at universities across the country. What they've found might help people protect their health as weather conditions change.

[Climate change](#) is not just a change in the global temperature; it is also a change in the weather. George Lubeck, the chief of the climate and health program at the

## HEALTH AND MEDICINE

RELATED ARTICLES

MRI SEES THE LESIONS THAT FLAG FUTURE KNEE PAIN

ENGINEERED PROTEIN MAY OFFER SAFE WAY TO TREAT OSTEOPOROSIS



Malaria will arrive in new areas, posing a risk to new populations, says Sadie Ryan, and the shift of endemic and epidemic areas will require changes to public health management. (Credit: United Nations Development Programme/Flickr)

## SPOTS IN AFRICA COULD GET TOO HOT FOR MALARIA

UNIVERSITY OF FLORIDA → Original Study

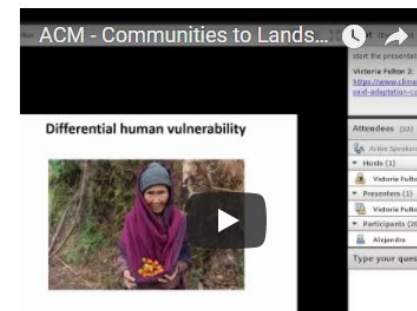
## ATLAS - Climate Change Adaptation, Thought Leadership and Assessments



ATLAS aims to improve the quality and effectiveness of climate risk reduction in development programs through tested, harmonized approaches to adaptation assessments; thought leadership; and by building the capacity of USAID and its partners. By integrating adaptation into development investments, ATLAS helps to safeguard and promote sustainable, climate resilient growth.

As awareness of the socioeconomic consequences of climate change grows, USAID Missions and partner governments are increasingly looking for support in assessing climate change vulnerability and improving climate-related decision making. Through new methodologies and tools

### USAID Adaptation Community Meeting Series



# Decisions will be made

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# **SHIFTING BURDENS: MALARIA RISK UNDER A CHANGING CLIMATE**

**Adaptation Thought Leadership and Assessments  
(ATLAS) Project**





# OBJECTIVE OF STUDY

Provide decision makers and stakeholders who implement malaria control programs (governments, NGOs, donors, etc.) with **targeted, detailed information** on *when* and *where* malaria suitability will shift in response to rising temperatures.





# RESEARCH QUESTIONS

- Where are **new areas** of endemic and seasonal suitability going to emerge where malaria was previously unsuitable?
- Where will **suitability increase**?
  - Seasonal areas becoming endemic
  - Moderately or marginally suitable areas becoming seasonal or endemic
- Where will **suitability decrease**?
  - Endemic areas becoming seasonal



When will these changes take place?



How many people will be at risk from these changes?

# METHODOLOGY

## Approach

Explore vector suitability in light of future climate model-based projections



**Mosquito species:** *Anopheles gambiae*



**Malaria pathogen:** *Plasmodium falciparum*



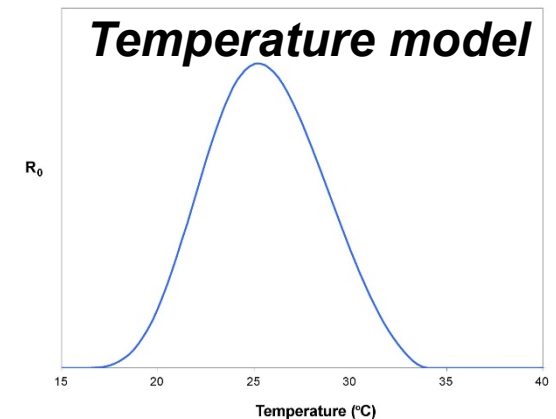
**Climate model:** multi-model ensemble (CMIP5)



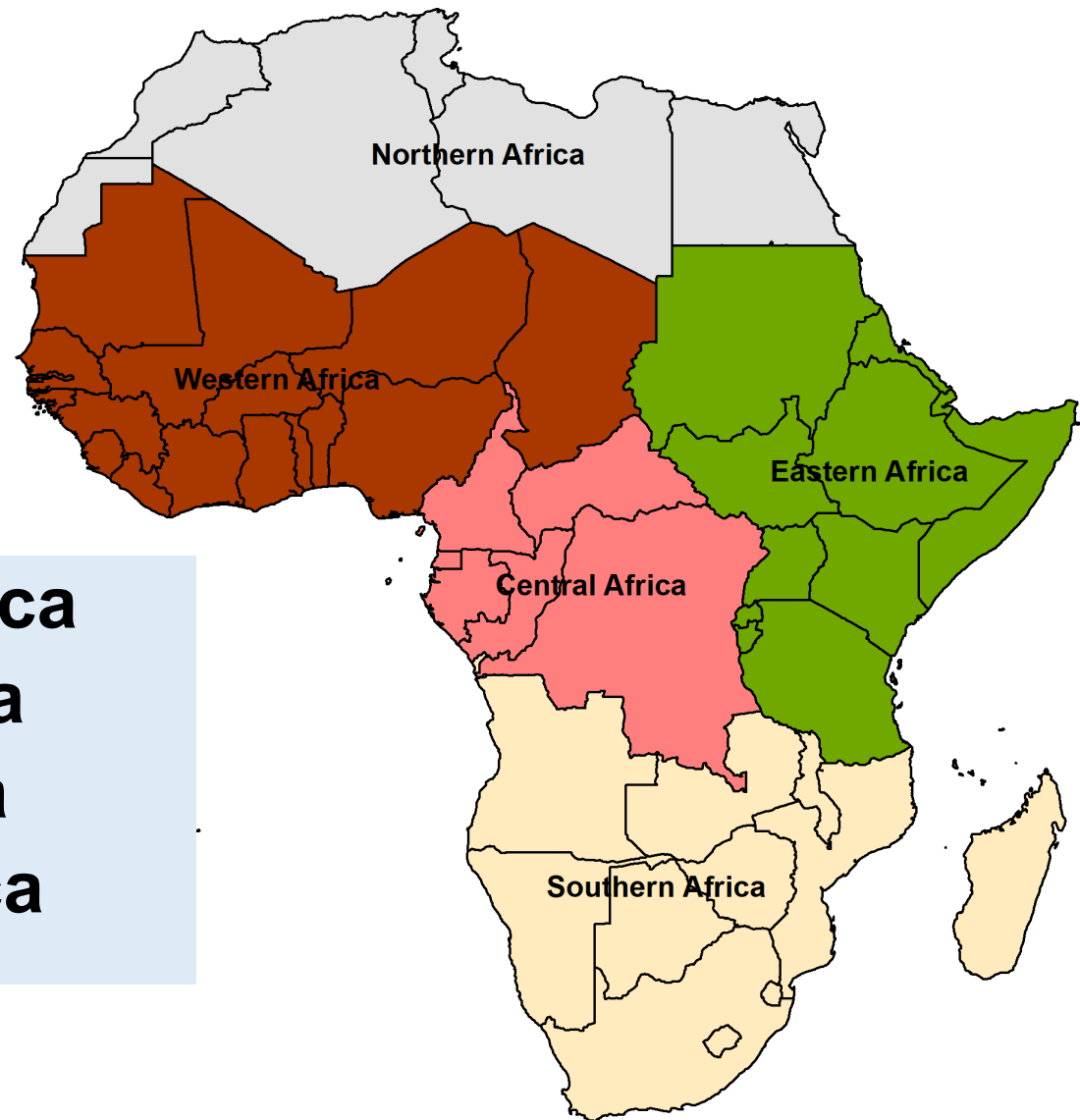
**Climate projections:** RCP 4.5 and RCP 8.5



**Time period:** 2030, 2050 and 2080



# A Regional Approach – Sub-Saharan Africa



- **Southern Africa**
- **Eastern Africa**
- **Central Africa**
- **Western Africa**

# Suitability, People, and Climate Changes

## Defining seasonality

**Endemic:** 10-12 months

**Seasonal:** 7- 9 months

**Moderate:** 4-6 months  
**Marginal:** 1-3 months

*Combined*

## People At Risk (PAR)

People living in areas defined suitable

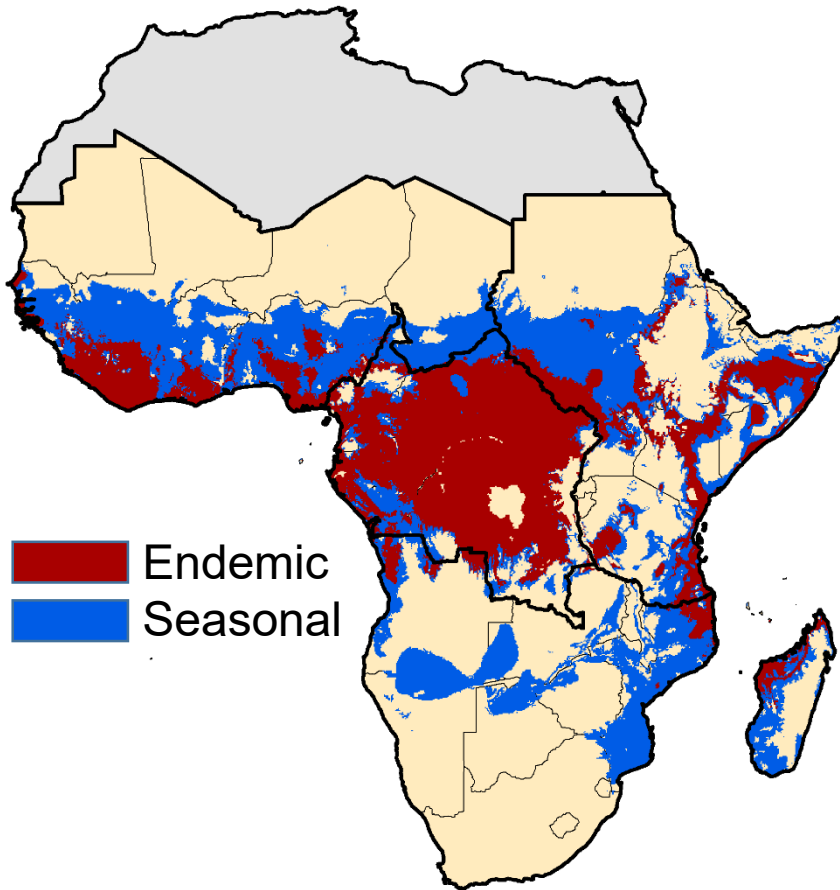
**GPW 2010 and 2020**

(Gridded Population of the World v4.11)

**Average annual temperature increases (°C) from baseline (1960–1990) by region, RCP, and time period**

Region	2030s		2050s		2080s	
	RCP 4.5	RCP 8.5	RCP 4.5	RCP 8.5	RCP 4.5	RCP 8.5
West Africa	1.32	1.57	2.29	2.32	2.84	4.38
East Africa	1.32	1.63	1.90	2.32	2.96	4.38
Central Africa	1.10	1.42	1.63	2.07	2.69	4.04
Southern Africa	0.94	1.28	1.33	2.01	2.51	4.08

# Current seasonal and endemic suitable areas for malaria transmission



200,000,000

160,000,000

120,000,000

80,000,000

40,000,000

0

## Current PAR

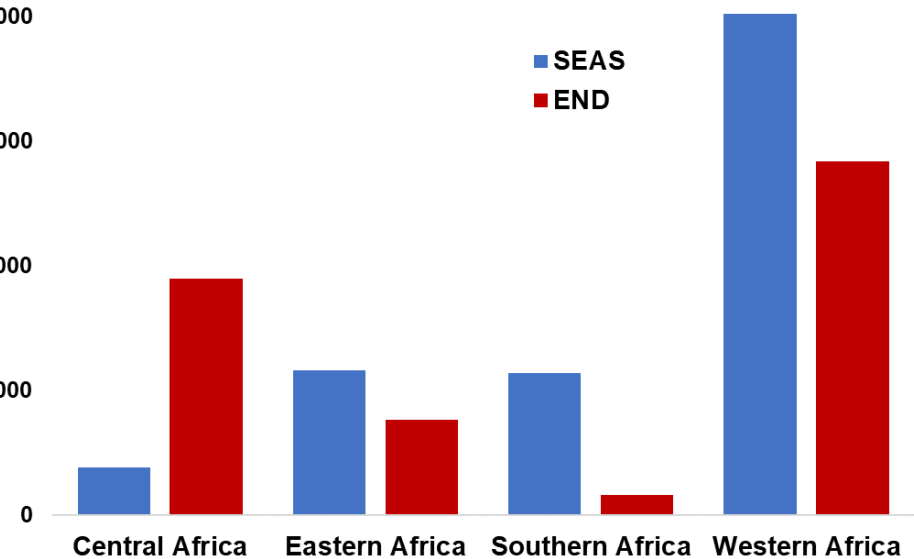
■ SEAS  
■ END

Central Africa

Eastern Africa

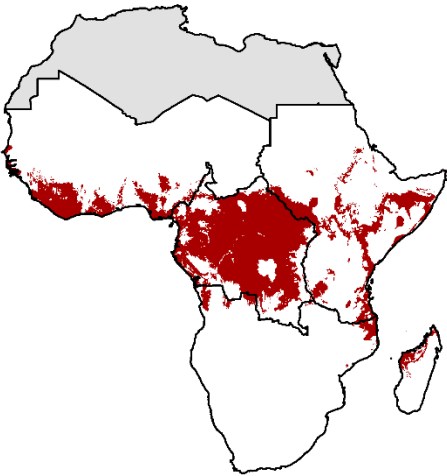
Southern Africa

Western Africa



# Current and futures- endemic

**Current**



**RCP 4.5 2030**



**RCP 4.5 2050**



**RCP 4.5 2080**



**RCP 8.5 2030**



**RCP 8.5 2050**



**RCP 8.5 2080**





# Current and futures - seasonal

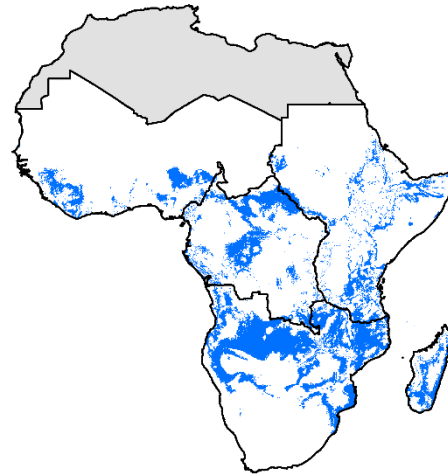
**Current**



**RCP 4.5 2030**



**RCP 4.5 2050**



**RCP 4.5 2080**



**RCP 8.5 2030**



**RCP 8.5 2050**

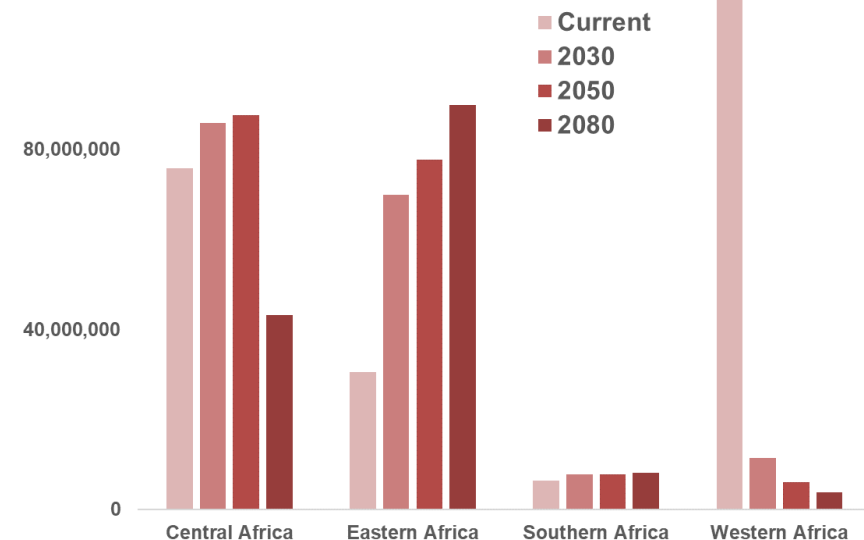


**RCP 8.5 2080**

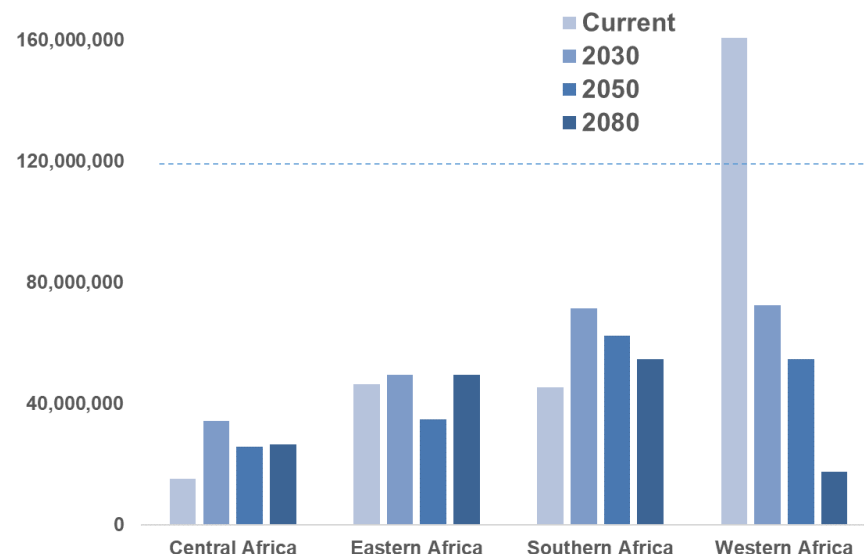


# People at Risk - PAR

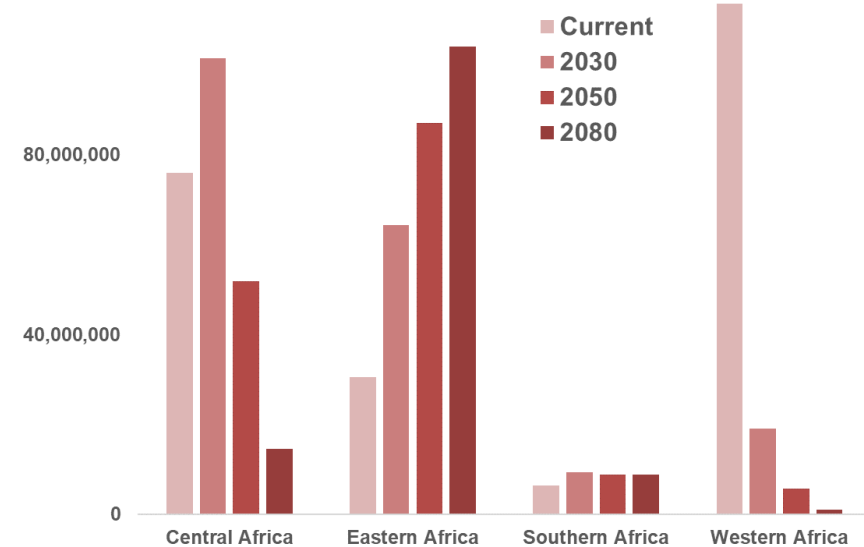
## RCP 4.5 Endemic



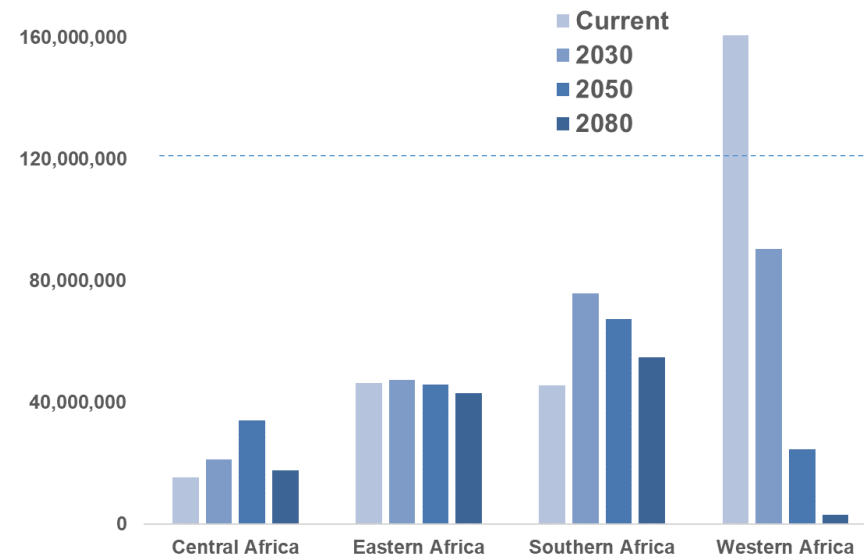
## RCP 4.5 Seasonal



## RCP 8.5 Endemic



## RCP 8.5 Seasonal



# RESEARCH QUESTIONS

- Where are **new areas** of endemic and seasonal suitability going to emerge where malaria was previously unsuitable?
- Where will **suitability increase**?
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- Where will **suitability decrease**?
  - Endemic areas becoming seasonal



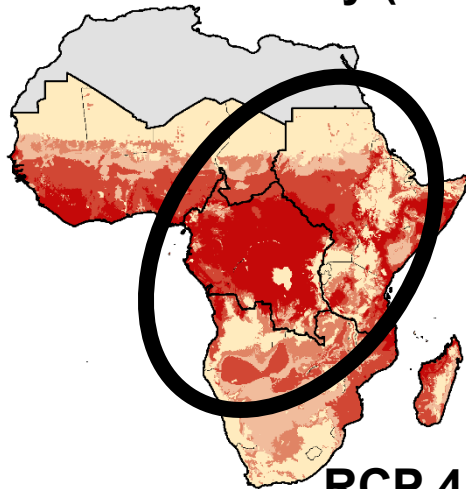
When will these changes take place?



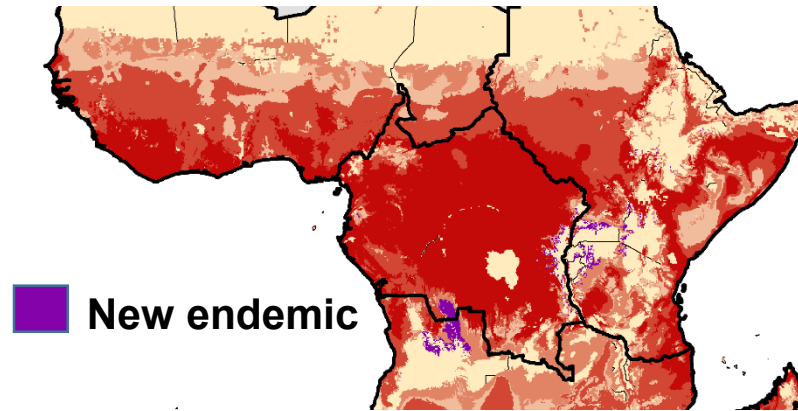
How many people will be at risk from these changes?

# NEW areas – unsuitable to endemic (RCP 4.5)

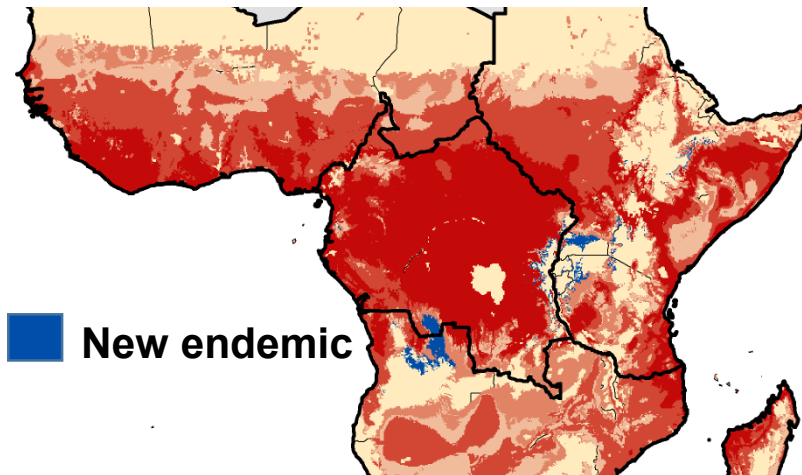
Current suitability (1-12 months)



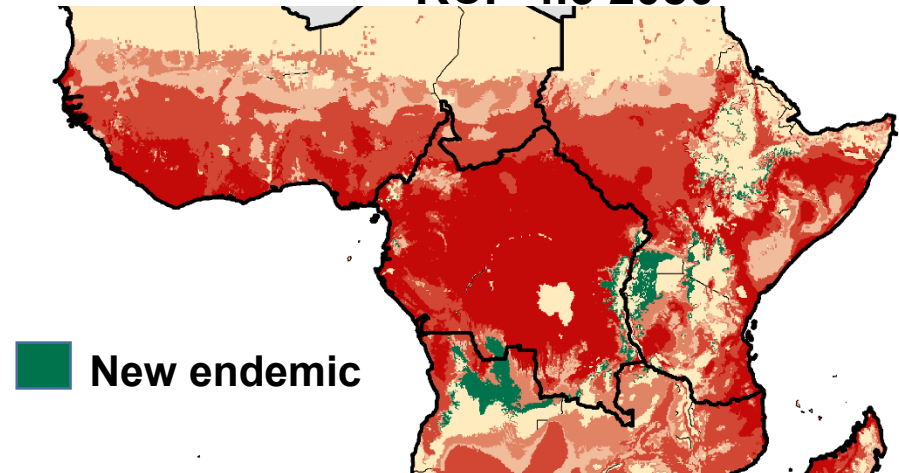
RCP 4.5 2030



RCP 4.5 2050



RCP 4.5 2080



# PAR in NEW endemic areas

100,000,000

Central Africa Eastern Africa  
Southern Africa Western Africa

80,000,000

60,000,000

40,000,000

20,000,000

0

RCP 4.5

RCP 8.5



RCP 4.5  
2030

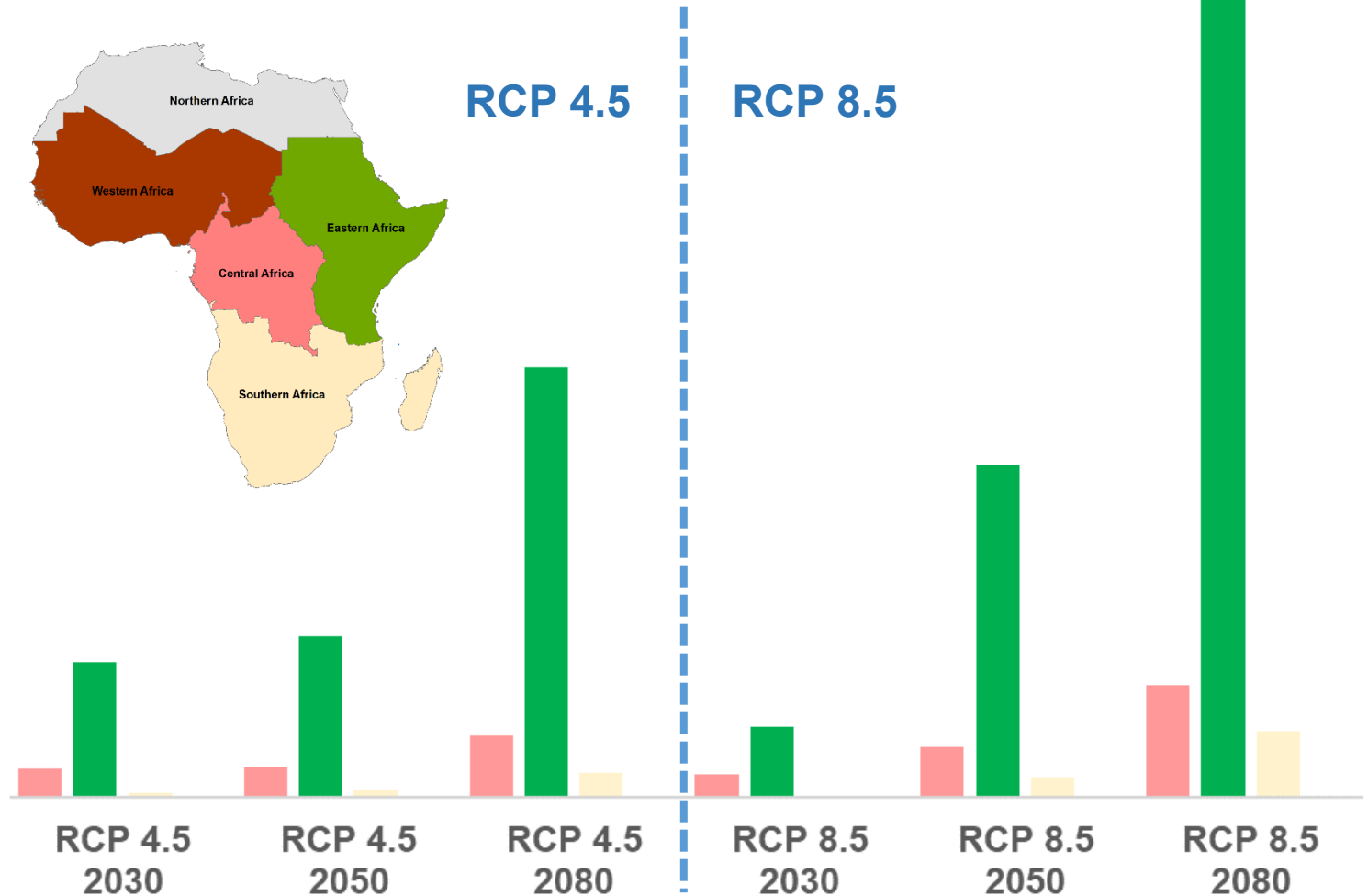
RCP 4.5  
2050

RCP 4.5  
2080

RCP 8.5  
2030

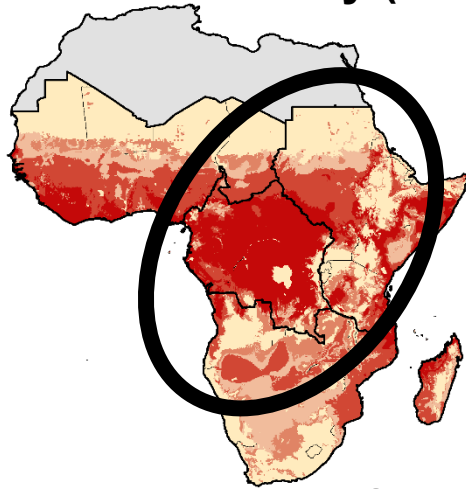
RCP 8.5  
2050

RCP 8.5  
2080

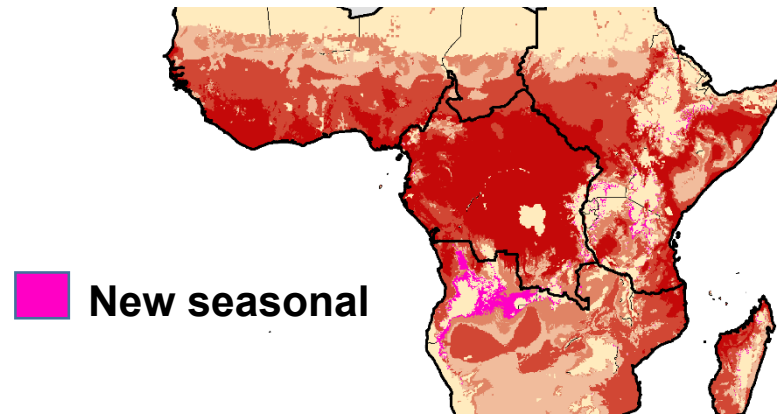


# NEW areas – unsuitable to seasonal (RCP 4.5)

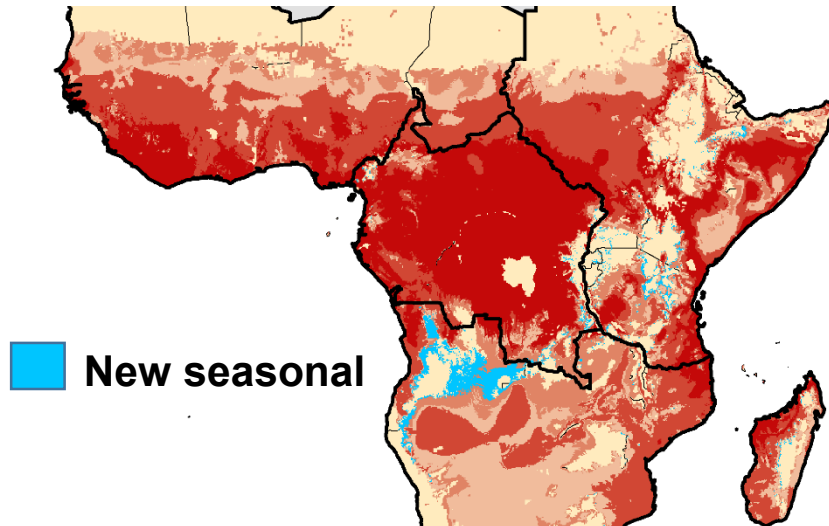
Current suitability (1-12 months)



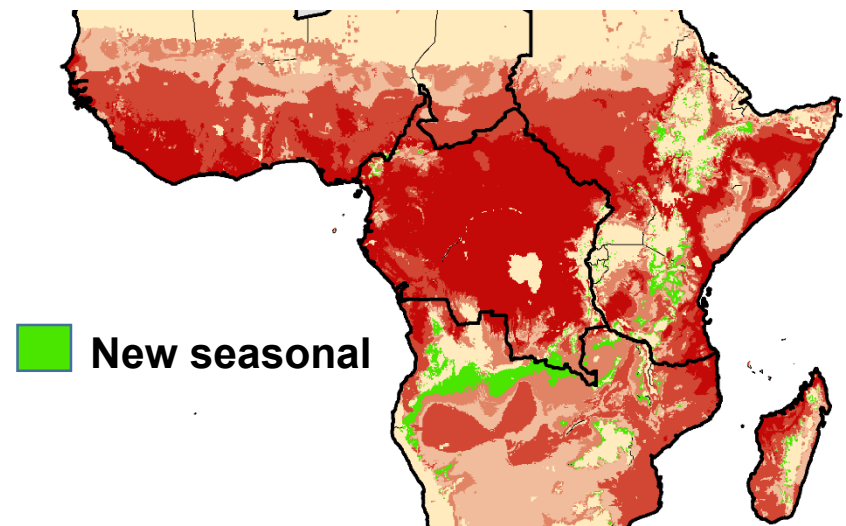
RCP 4.5 2030



RCP 4.5 2050



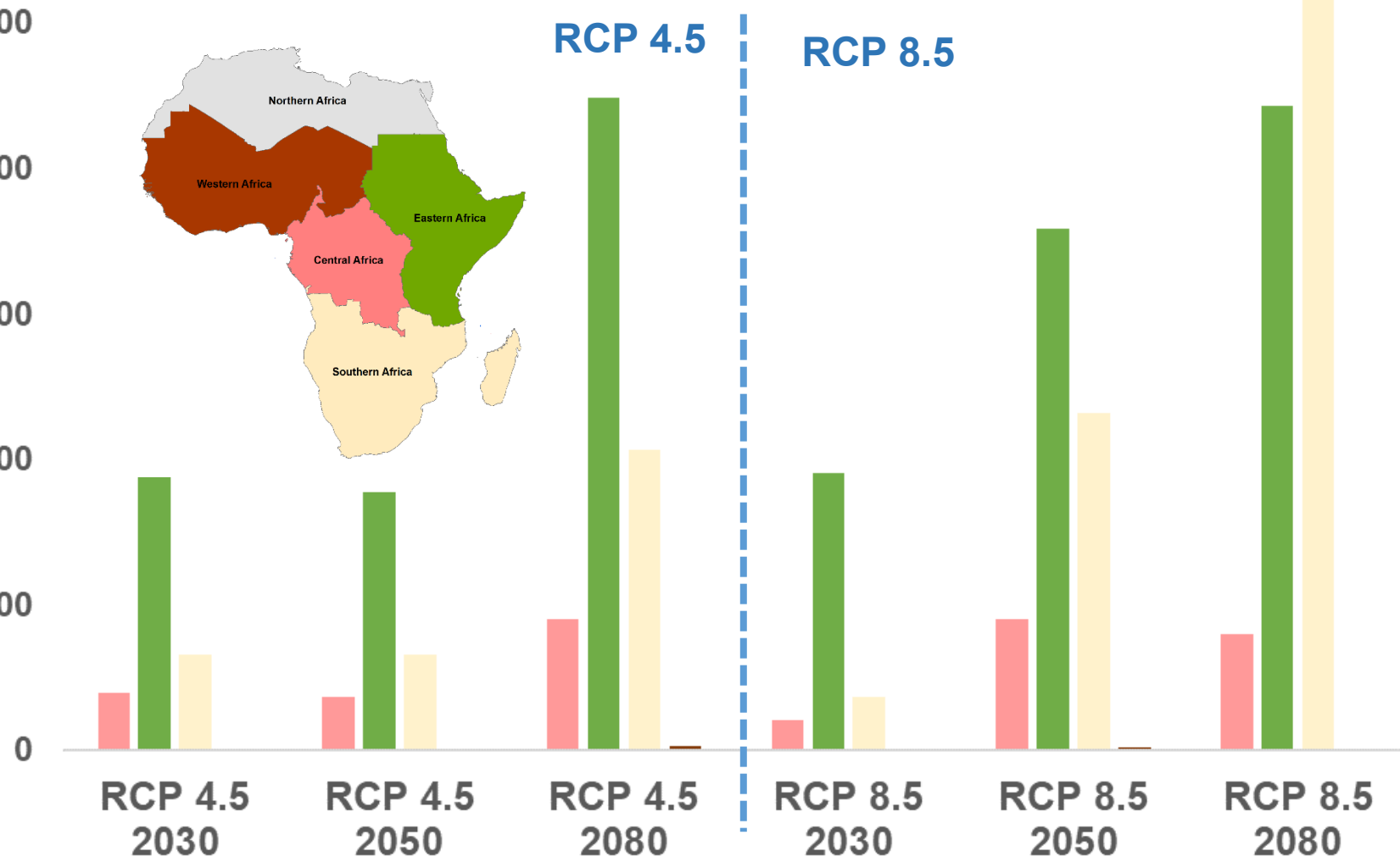
RCP 4.5 2080





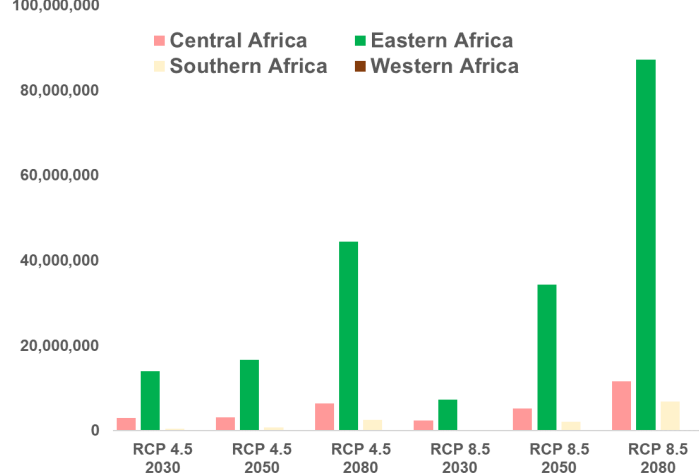
# PAR in NEW seasonal areas

Central Africa Eastern Africa  
Southern Africa Western Africa

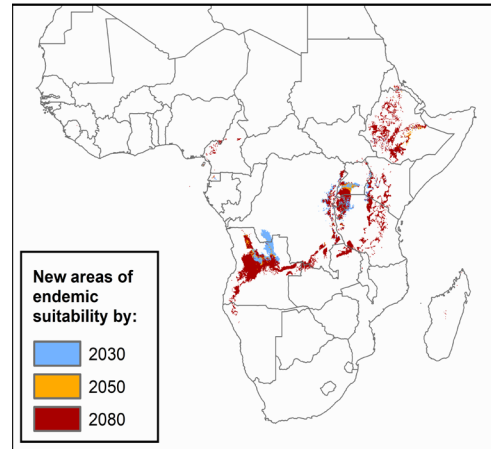


# Big Messages?

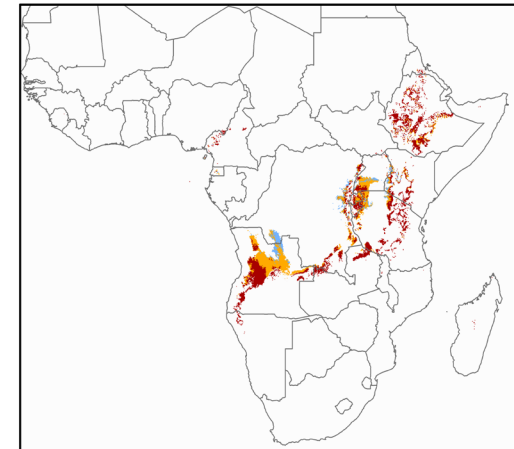
PAR in NEW endemic areas



RCP 4.5



RCP 8.5



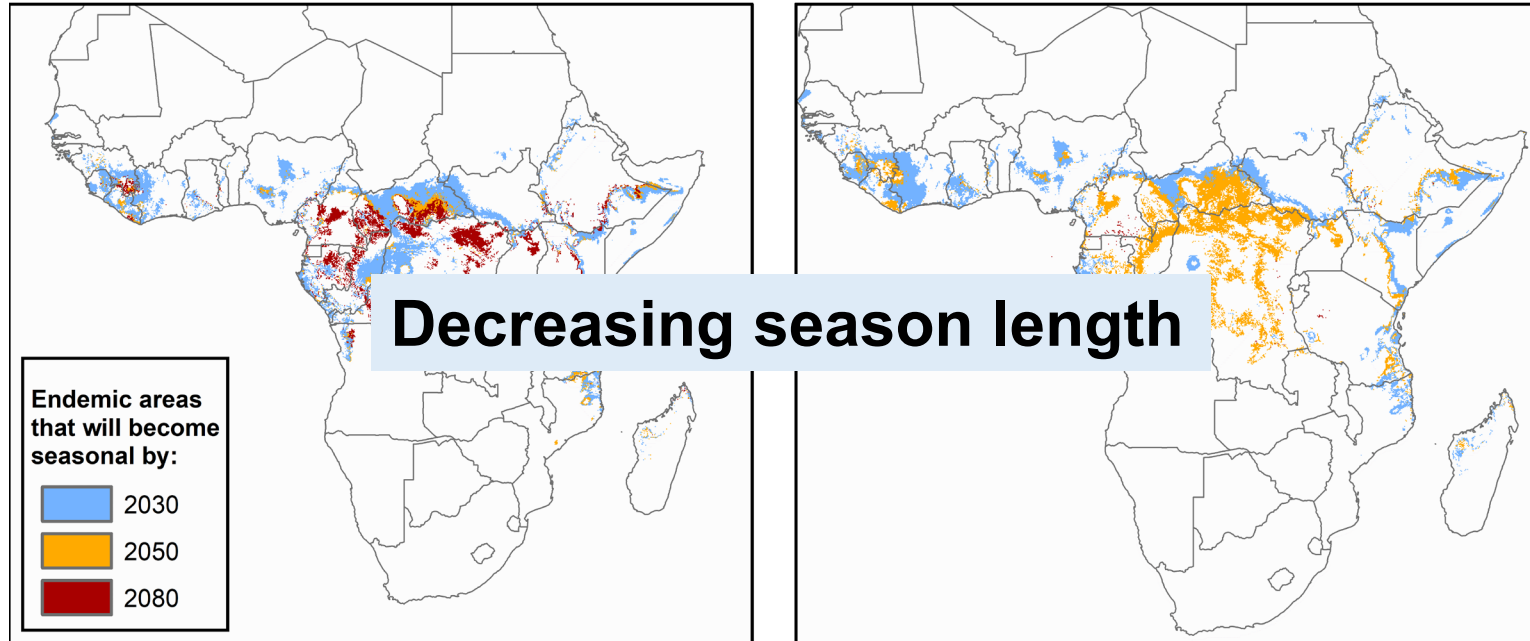
An additional 16 to 18 million people will shift from areas of *no suitability* risk (0 months) to *endemic* (10-12 months) malaria exposure in Sub-Saharan Africa **by the 2030s**, with a significant portion of these located in East Africa.

# Big Messages?

RCP 4.5

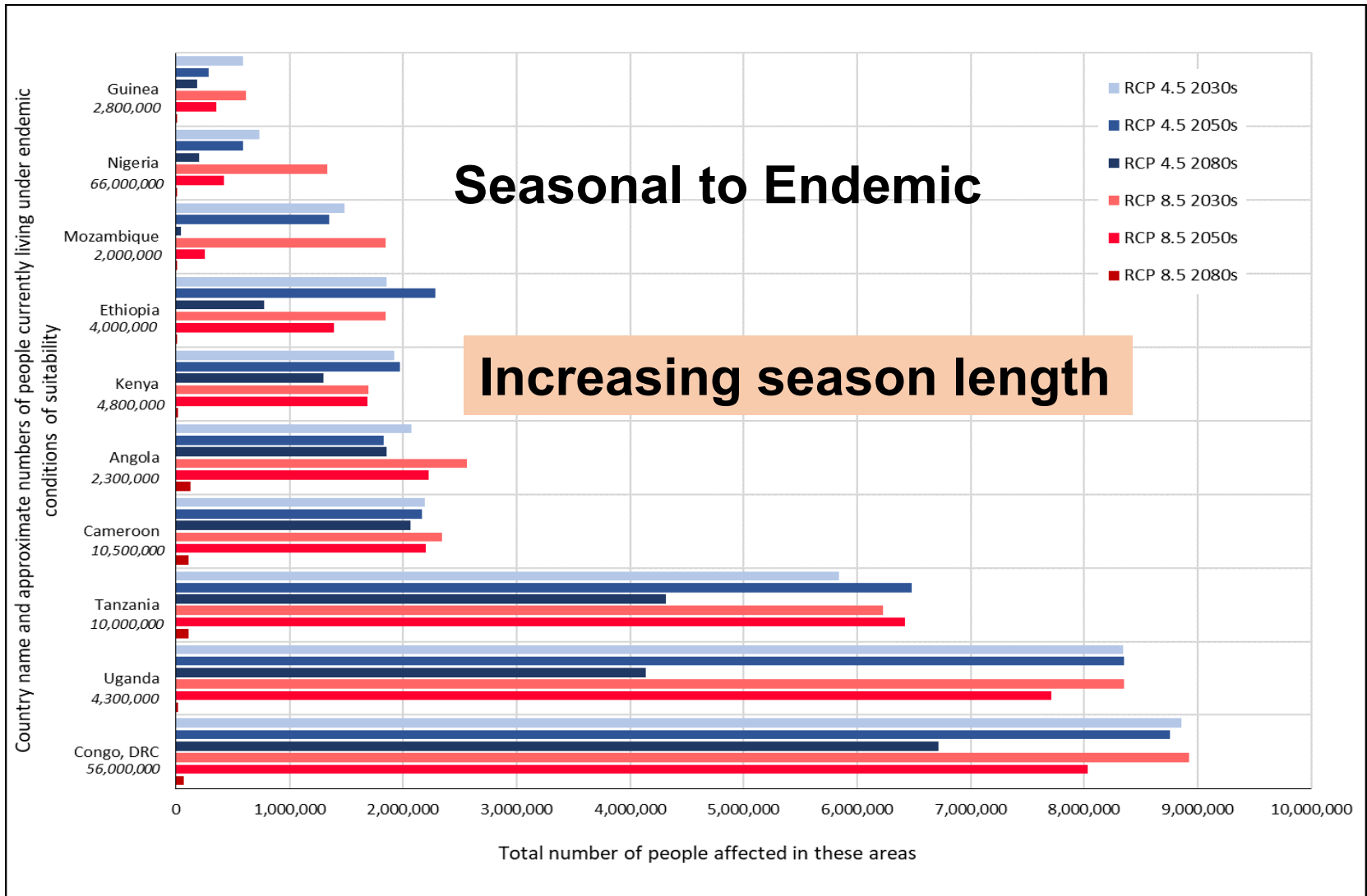
*Too hot for malaria?*

RCP 8.5



- Approximately 47 to 58 million people will see reduced endemic (10-12 months) risk but will still experience marginal to moderate risk (1-6 months), in Western Africa due to the exceedance of thermal thresholds for mosquitoes.
- The net change in numbers of people at any risk of malaria transmission (those moving from endemic, seasonal or no suitability to marginal/moderate malaria exposure) in West Africa will be an increase of approximately 65 million people by the 2030s under the best-case scenario (RCP 4.5).

# Big Messages?

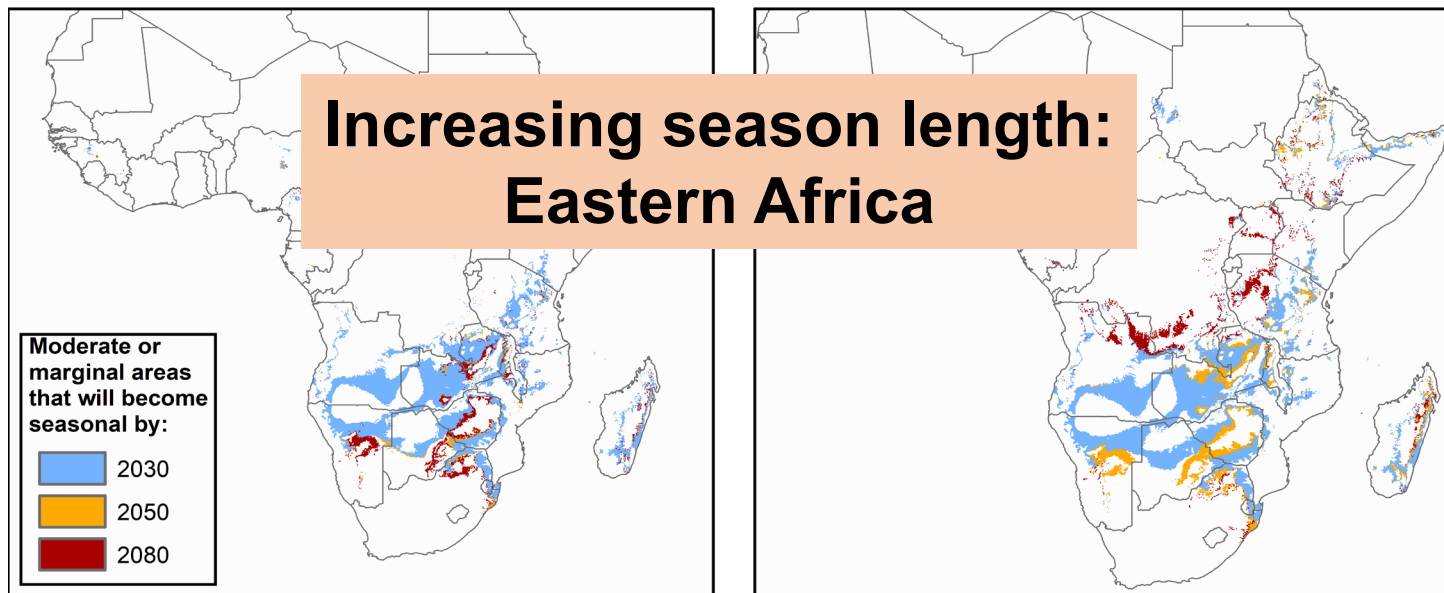


# Big Messages?

Areas that are currently moderately or marginally suitable (1-6 months) for transmission but will shift to seasonally suitable (7-9 months) are found mainly in Eastern Africa.

RCP 4.5

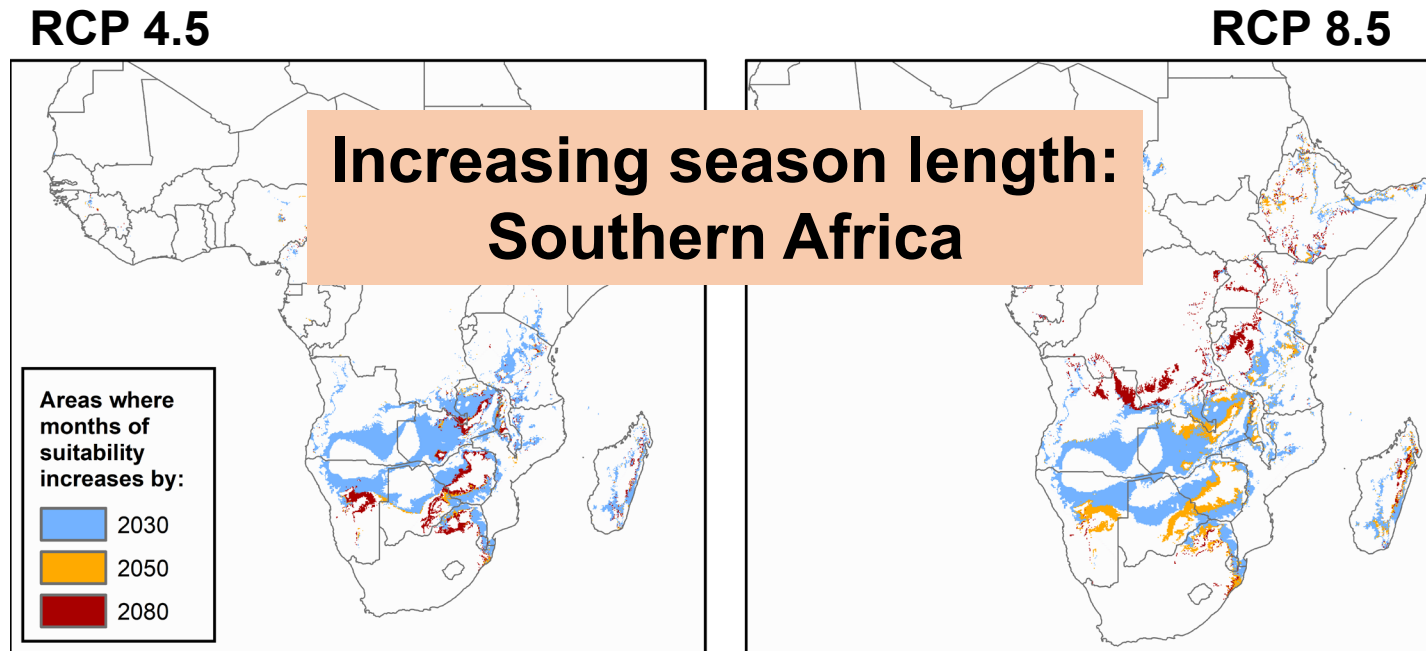
RCP 8.5



This includes large portions of Tanzania and Uganda

# Big Messages?

Areas where moderate or marginal suitability will become seasonal include the Southern Africa region: Zambia, Malawi, eastern South Africa, Botswana, the highlands of Zimbabwe, northern Mozambique, and the Zambezi River Basin.



- These changes will put approximately 17 to 21 million people at increased risk from transmission in Southern Africa under the best case scenario (RCP4.5) by 2030.
- In Zambia alone, this adds an additional ~9 to 12 million people (across climate scenarios) to those currently living in seasonal risk.

# IMPLICATIONS FOR POLICY AND RESPONSE FOR NEW AREAS OF EMERGING SUITABILITY

## What's at risk?

Malaria outbreaks where people have little or no immunity to the disease can often lead to epidemic conditions, especially among vulnerable groups such as women and children.

## What's the opportunity?

Targeted and concentrated surveillance at the edge of malaria's range offers the opportunity to control potential epidemic outbreaks as they happen and can reduce the risk of novel outbreaks.





# IMPLICATIONS FOR POLICY AND RESPONSE FOR AREAS WHERE MONTHS OF SUITABILITY INCREASE

## What's at risk?

One key concern is where and how increased temperatures will lengthen the period of the year during which diseases can be established and transmitted. Current management and control interventions may need to be reviewed and revised to account for likely increased incidence.

## What's the opportunity?

Malaria response programs will need to be extended, planning for increasing resource needs (e.g. staff time, medicines) as well as costs, and requiring an ***extended investment pipeline***.



# IMPLICATIONS FOR POLICY AND RESPONSE FOR AREAS WHERE MONTHS OF SUITABILITY ARE REDUCED

## What's the opportunity?

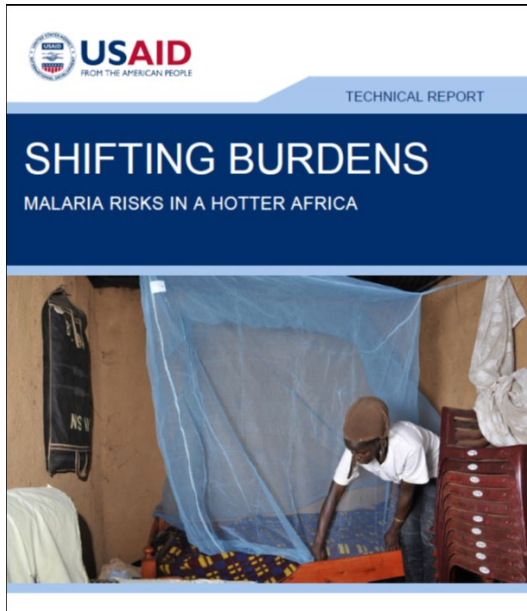
Seasonal response can be refined and targeted – either reducing the cost of interventions or potentially eradicating malaria exposure in these areas.



## Decisions will be made...

- Target on-ground surveillance and responses to changing epidemiology
- Improve a country's capacity for collecting and using information at the national level
- Build capacity in health systems
- Refine country selection and strategic budgeting for international programs
- Develop regional approaches and partnerships

# Thank you



Technical report coming soon  
to [Climatelinks.org](http://Climatelinks.org)

Sadie J. Ryan, PhD.

Graduate Coordinator, Department of  
Geography

University of Florida Term Professor;  
Early Career Fellow, Florida Climate  
Institute

Associate Professor, Medical  
Geography

[sjryan@ufl.edu](mailto:sjryan@ufl.edu)

[www.sadieryan.net](http://www.sadieryan.net)

