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Title: Modeling the impact of spatial heterogeneity, behavior change, and mitigations on the current Ebola epidemic

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# Modeling the the impact of spatial heterogeneity, behavior change, and mitigations on the current Ebola epidemic

Update to MIDAS group, 7 October, 2014

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(LANL)

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(Tulane)

# Multi-Scale Epidemiology (MuSE)

## to capture evolving spatial heterogeneity

Combines the advantages of network patch SEIR-like models:

- exponential epidemic rise, saturation, and fall in well-mixed compartments
- rapid to compute
- easy to match to empirical data

with the advantages of agent-based models at larger scales:

- flexible and explicit rule-based mitigations
- realism (transferability)
- multi-pathogens and age cohorts, with arbitrary transmissibility and susceptibility matrices between hosts
- **Like a risk-map, but with dynamics**

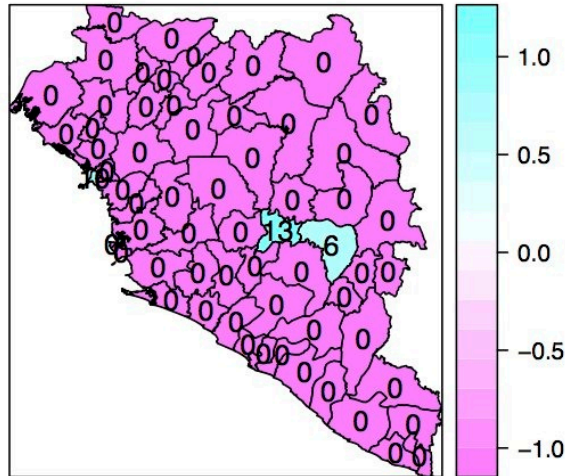
MuSE references:

- Manore, et al. Rinderpest, BMC Res. Rep, 2011
- McMahon, et al. RVF, Math. Mod. Nat. Phen. 2014
- Labute, et al., FMD, HPAI in USA, ISPRS J., 2014
- Jeanne Fair lead much of this development → CBEP

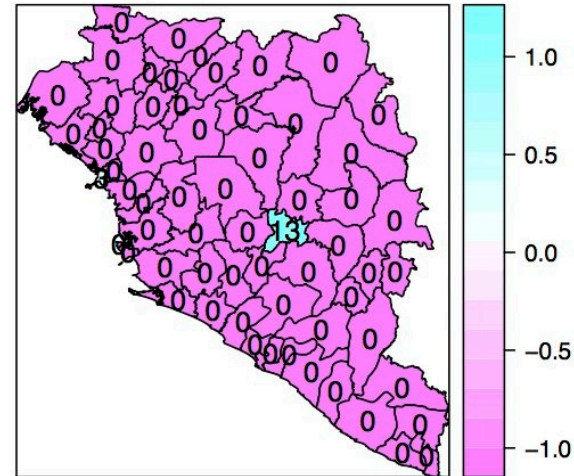
# Need for spatial-temporal epidemic models

Early weekly cases stayed confined to a few small regions

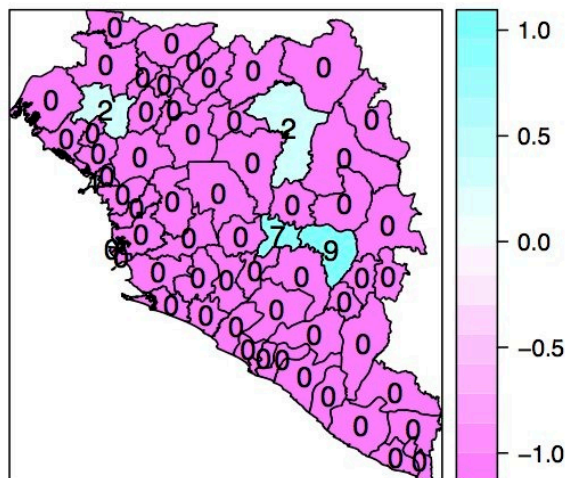
Weekly cases, ~17 March



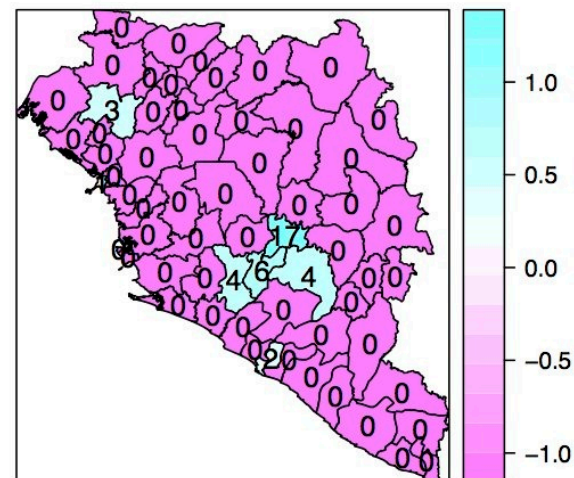
Weekly cases, ~14 April



Weekly cases, ~12 May



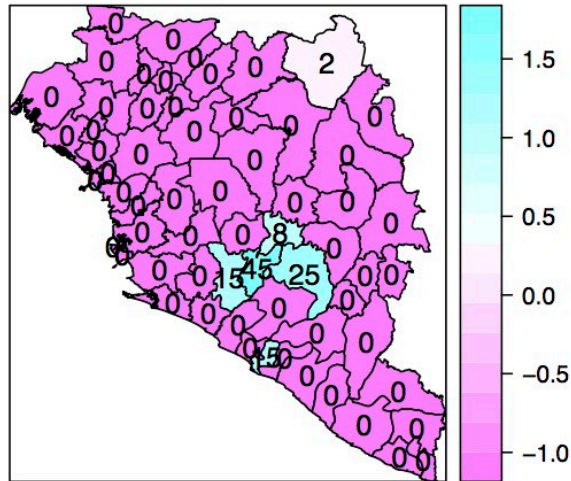
Weekly cases, ~9 June



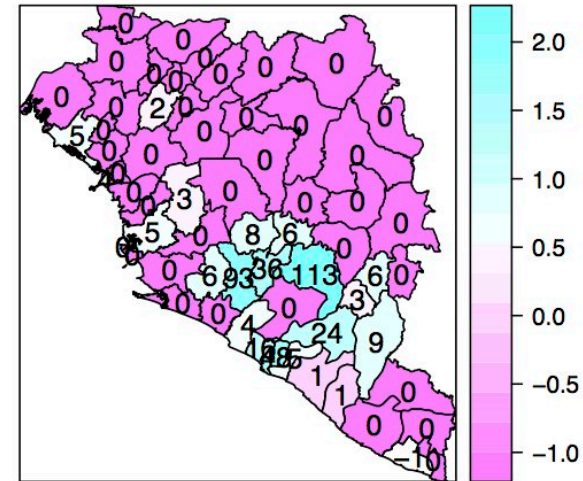
## Need for spatial-temporal epidemic model

## Weekly cases spread slowly to nearby counties

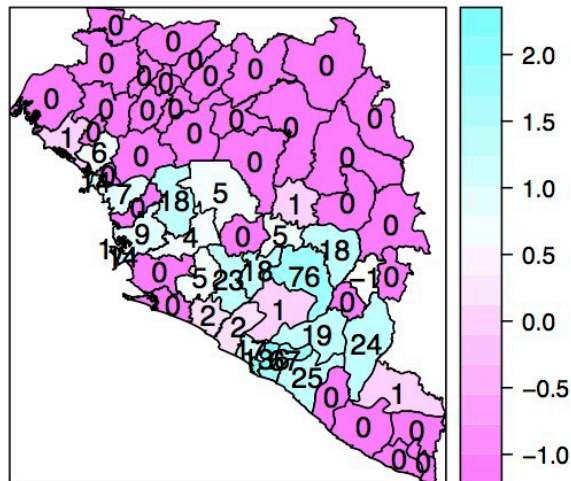
### Weekly cases, ~7 July



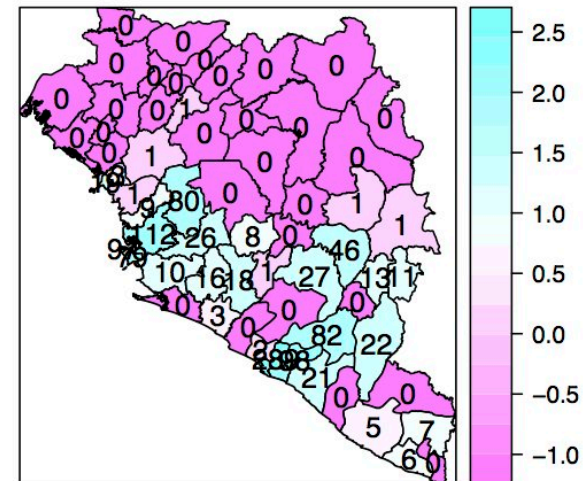
### Weekly cases, ~1 August



### Weekly cases, ~1 September

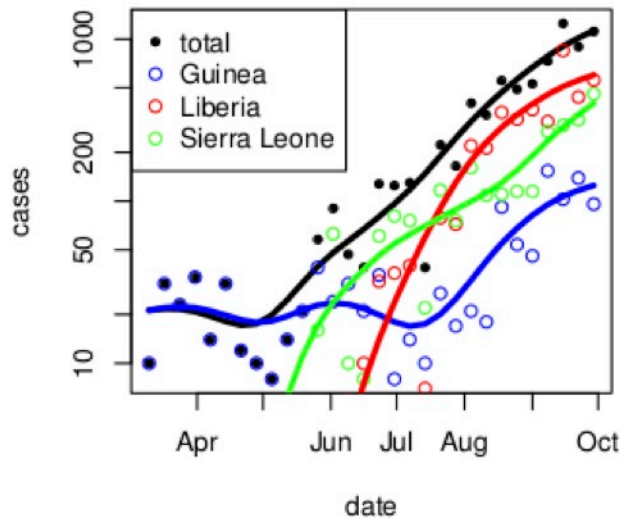


**Weekly cases, ~1 October**

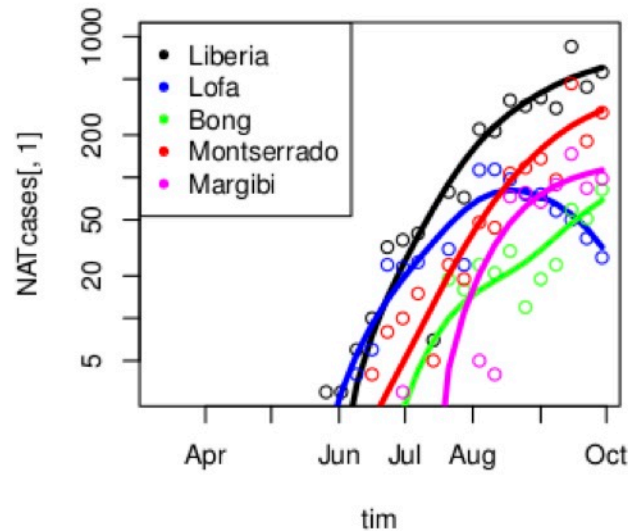




Weekly cases, by country

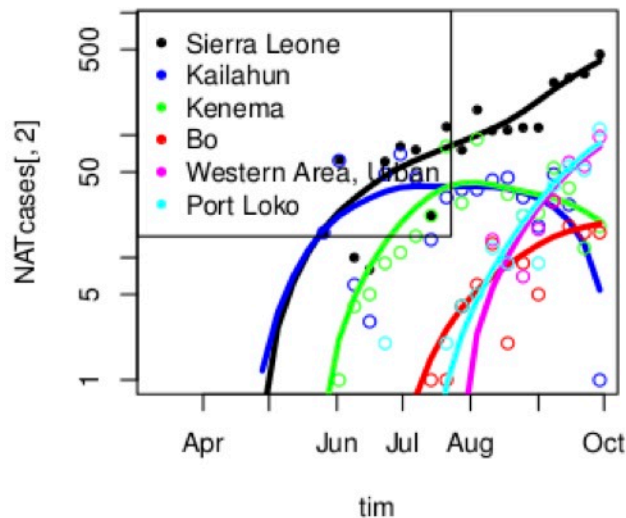


Liberia weekly cases

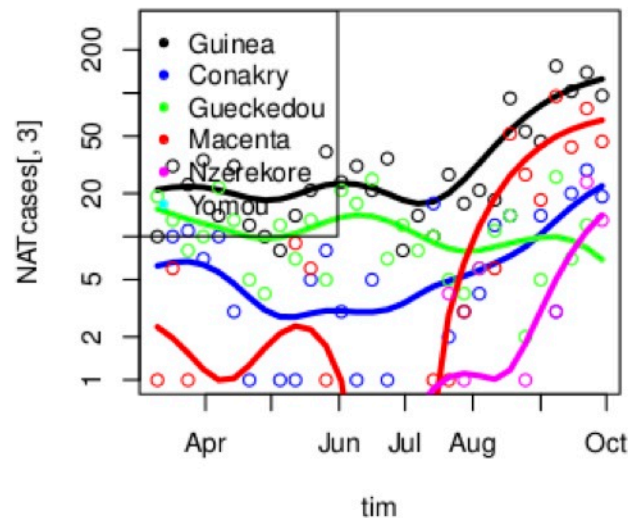


Time-courses confirm significant geographic heterogeneity under 'relentless exponential growth' in aggregate data.

Sierra Leone weekly cases



Guinea weekly cases



Gueckedou, Lofa, and Kailahun, improving & the cities getting worse.

Three drivers are behind this heterogeneity:

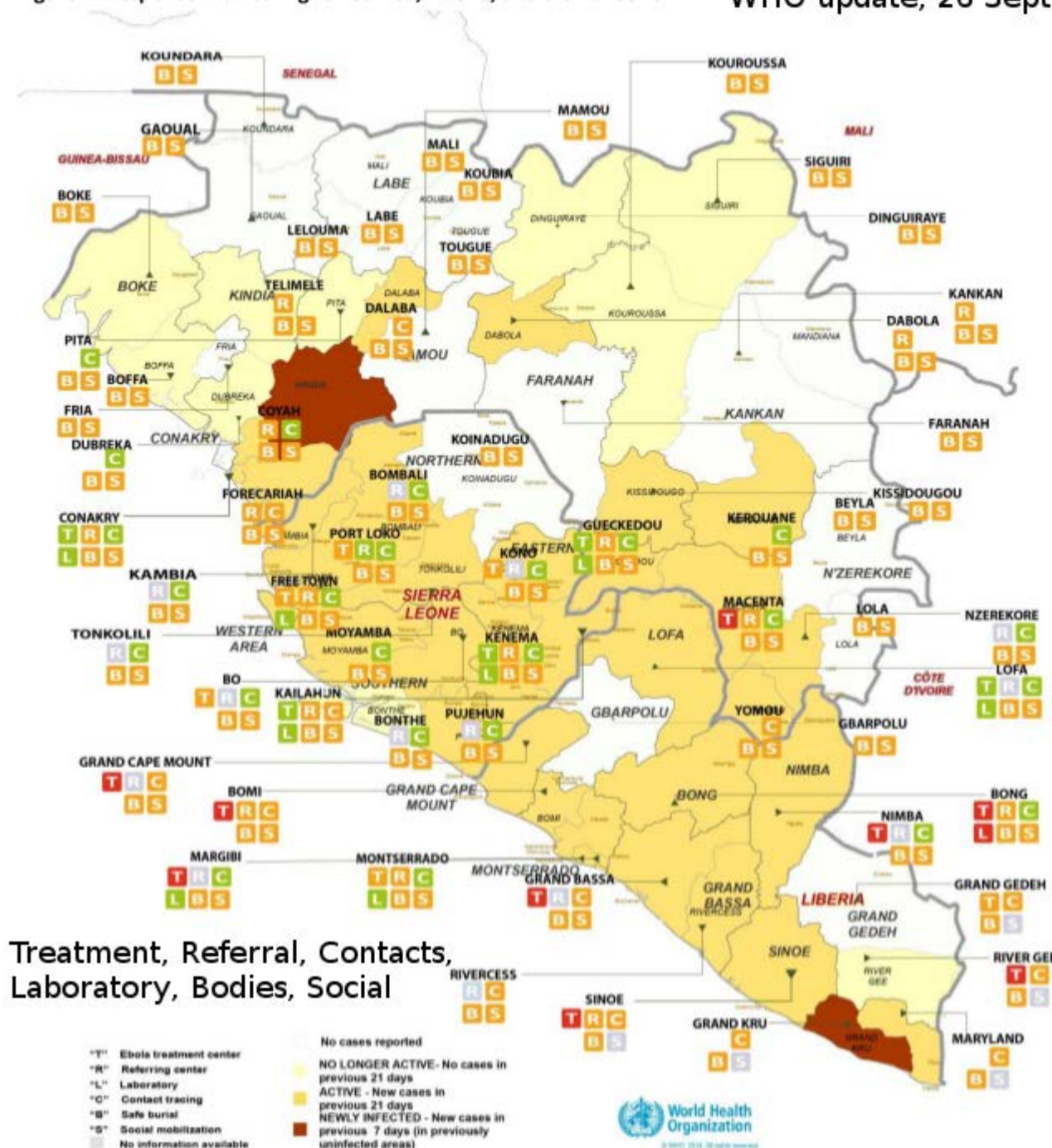
- Re-introductions
- Learning curves
- Resource limitation

**Symbols:** Weekly counts taken from publically available Ministry of Health data.

**Lines:** Smoothing splines to guide the eye.

Figure 2: Response monitoring for Guinea, Liberia, and Sierra Leone

WHO update, 26 Sept.



The 'learning curve' from WHO

Defined in six areas:

Treatment

Referral

Contact tracing

Laboratory capacity

Safe body recovery

Social mobilization

In terms of:

Not needed

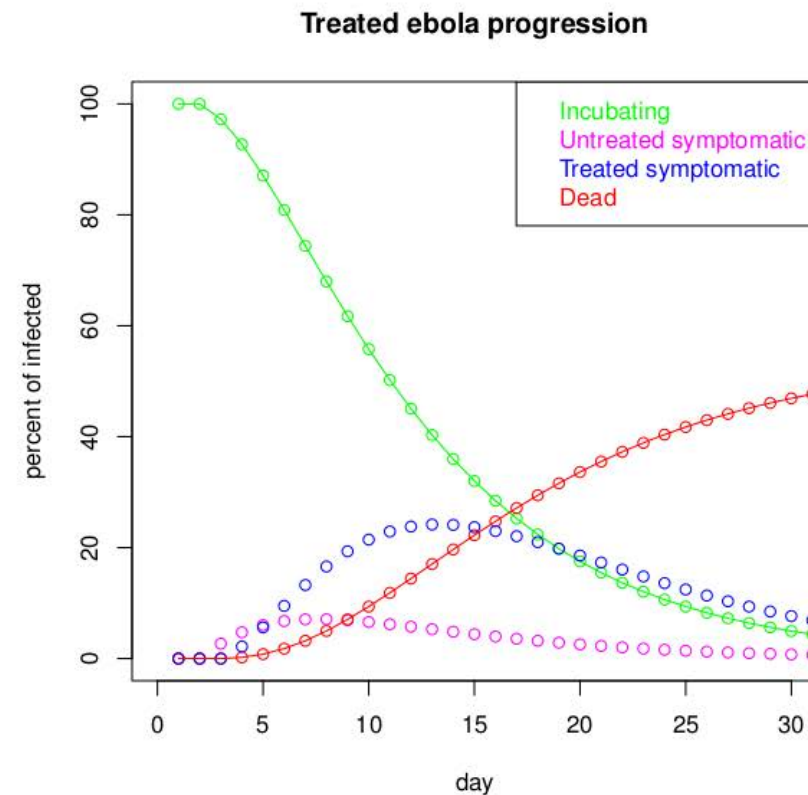
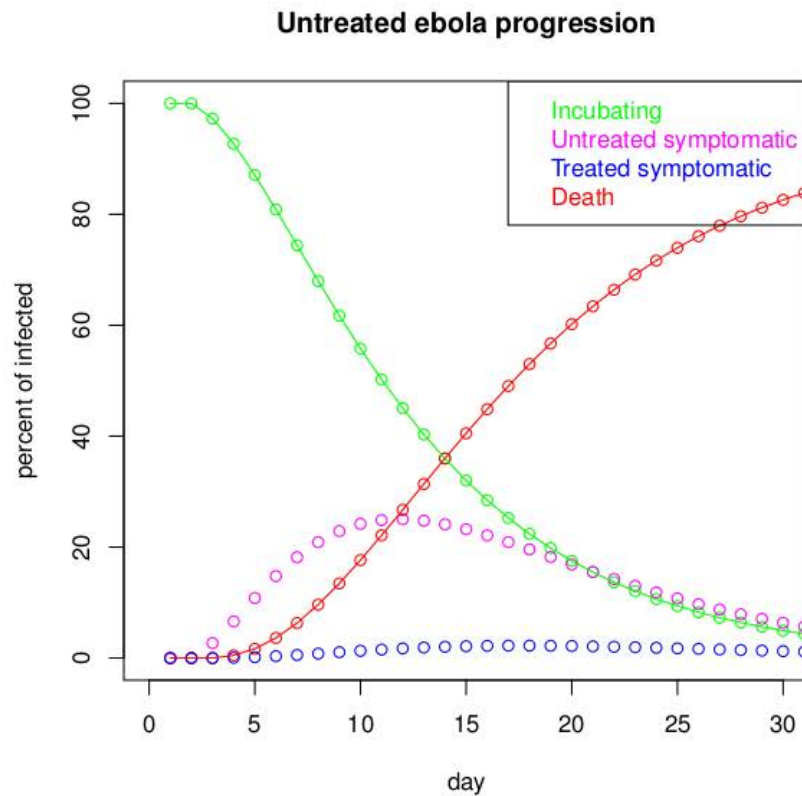
Functional

Plan in place

Non-functional



# Disease progression strongly couples treatment to transmission control



Adapted from Chowell, Hengartner, Castillo-Chavez, Fenimore, Hyman, "The basic reproductive number of Ebola and the effects of public health measures: the cases of Congo and Uganda" J. Theor. Biol. 7:119-126 (2004).

We are working back and forth between  
fits to data in slide 3 and ways of  
representing mitigations vs. time and  
county