



# The Extended Family of Randomized Roll-Out Designs, Including Stepped Wedge and Dynamic Wait Listed Designs

C Hendricks Brown  
Feinberg School of Medicine, Northwestern University  
Departments of  
Psychiatry and Behavioral Health  
Preventive Medicine  
Medical Social Sciences  
[Hendricks.brown@northwestern.edu](mailto:Hendricks.brown@northwestern.edu)



# Acknowledgments

## **Funding Acknowledgments:**

NIMH funded Methodology for MH/Drug Prevention & Early Intervention" (R01MH040859 Brown PI)

NIDA funded Center for Prevention Implementation Methodology (Ce-PIM) for Drug Abuse and Sex Risk Behavior (P30DA027828, Brown PI)

NIMH FUNDED RCT OF GATEKEEPER TRAINING FOR SUICIDE PREVENTION (R34MH071189, Wyman PI)

NIMH funded COMMUNITY DEVELOPMENT TEAMS TO SCALE-UP MTFC IN CALIFORNIA ( R01MH076158, Chamberlain PI)

NIDA KIDS: KNOWING ABOUT INTERVENTION IMPLEMENTATION IN DETENTION SITES (U01-DA036233, DiClemente PI)

## **Co-Authors**

Peter Wyman, University of Rochester

David Henry UIC

Shannon, Knoblauch, UIC

# Randomized Roll-Out Designs and their Cousins

1. Concept and Appeal of Roll-Out Designs  
Examples
2. Advantages of a Rollout Design  
Community  
Researcher
3. Roll-Out Design and Analysis Choices
4. Summary and References

# 1. Concept and Appeal of Roll-Out Designs

- **Location/Policy Maker/Community/organization/agency**

Very committed to wide-scale delivery of a particular intervention

Ultimately desire scale out or have everyone to get this intervention

Unwilling to or uncomfortable withholding the intervention by using “controls”

- **Intervention**

Little or no information available on its benefit or potential harm

Cannot provide to everyone at once because of logistics/resources

- **Subregions**

Community can be divided into subregions or areas where intervention can be implemented independently

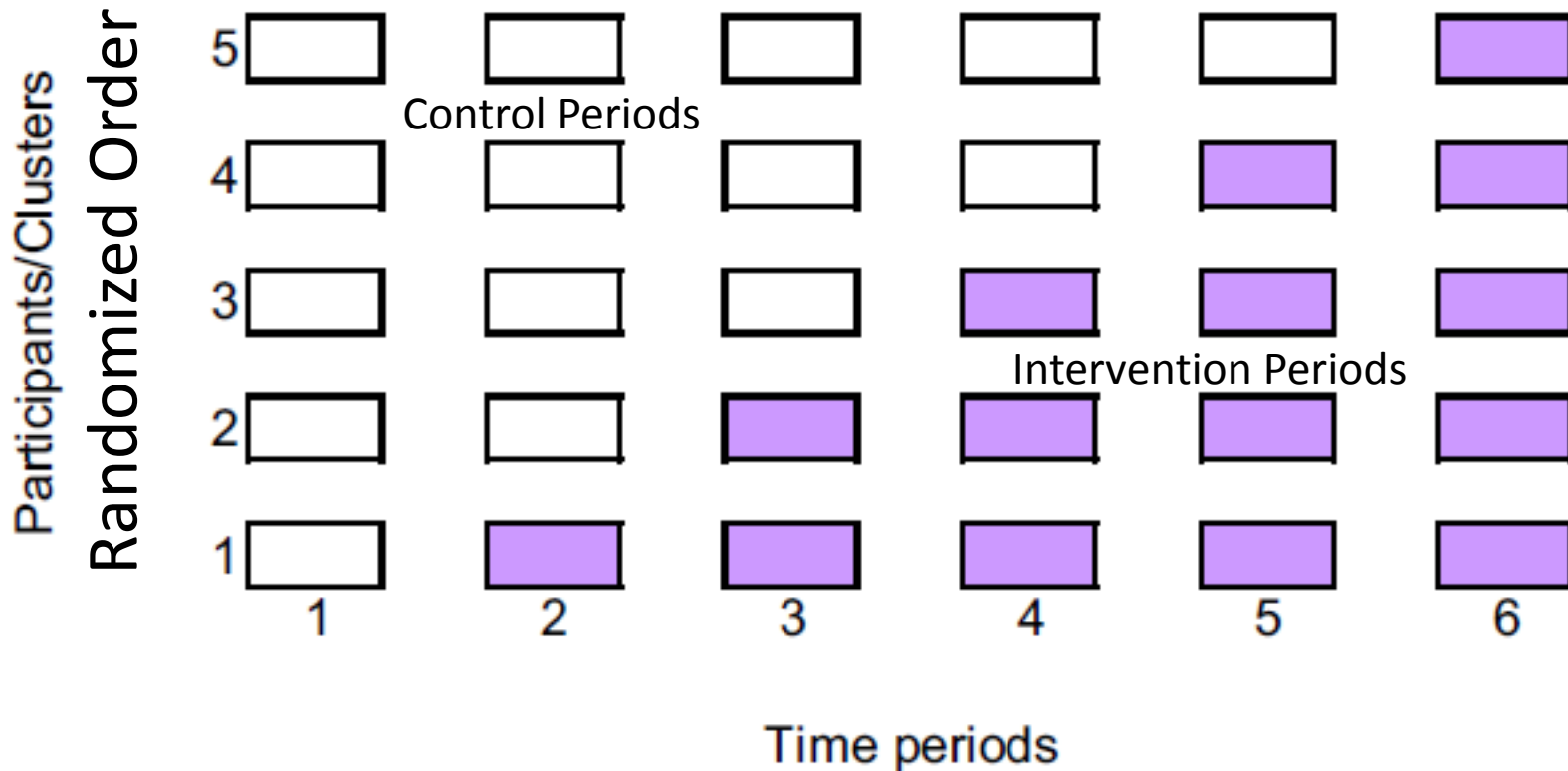
Outcomes can be assessed in a relatively short period of time

It is possible to construct a rigorous randomized trial to evaluate this intervention by randomizing the timing of when the intervention is introduced.

# Randomized Roll-Out Designs Wyman et al., Prev Sci 2015

Units are randomized to when they get the intervention (roll-out)

Randomize by Place and Time -- CH Brown et al., (2009) Ann Rev PH



Stepped Wedge Design – Brown CA & Lilford, BMC Med Research Meth, 2006

# Examples

Location	Intervention	Subregions	Name	Year	Ref
Gambia	Hepatitis B Vaccination	17 Vaccination Areas	Stepped Wedge	1987	Gambia Hepatitis Study Group, Cancer Research
Eugene OR & Santa Barbara CA	Mpowerment HIV Prevention for MSM	2 Cities	(Pairwise enrollment) wait-listed design	1996	Kegeles et al., AJPB
Cobb County School District, GA	QPR Youth Suicide Prevention	32 Secondary Schools	Dynamic Wait-Listed Design	2006	Brown et al., Clin Trials
CA and OH Counties	Compare 2 Implementation Strategies for Multidimensional Treatment Foster Care	51 Counties	Head-to-Head Randomized Roll-out Design	2010	Chamberlain et al.

# Randomized Roll-Out Designs as a Categorical Name

- More functional and appealing to communities than jargon like Stepped-Wedge and Dynamic Wait-Listed Designs
- Misuse of the term Stepped-Wedge
  - Standard Condition → Single Active Intervention
  - Standard Condition → Randomize to Intervention A or B
- There are many examples of roll-out designs

# 2. Advantages of Roll-Out Designs

## From a Policy Maker or Community Perspective

### **Ethical Issues**

No one should be denied a potentially useful program, as long as it can be delivered with fidelity – Roll-out trials

Traditional research designs like RCTs are unacceptable or foreign in some minority communities and for many policy makers

Allows for programs to improve over time

Decision on which subregion gets the intervention first is fair.

Go First: Immediate access to a potentially beneficial program

Go Later: Program potentially improved through experience



# 2. Advantages of Roll-Out Designs From a Researcher's Perspective

## **Ethical Issues**

When communities don't hold equipoise about a prevention program

Roll-out designs minimize withholding of a potential beneficial intervention

## **Statistical Advantages**

Improvement over alternative designs

Avoids "readiness bias" of non-randomized community studies

Statistically efficient compared to wait-listed designs – Brown et al. Clinical Trials

This is a True experiment producing strong causal inferences

Even with modest numbers of subregions – Brown et al., Clin Trials 2006

Allows for modeling time and subregion effects – Wyman et al., Prev Sci 2015

Wide range of design choices

Adoption of a New Intervention

Head-to-head Comparisons of two interventions or implementation strategies Brown et al., Ann Rev PH (in press)

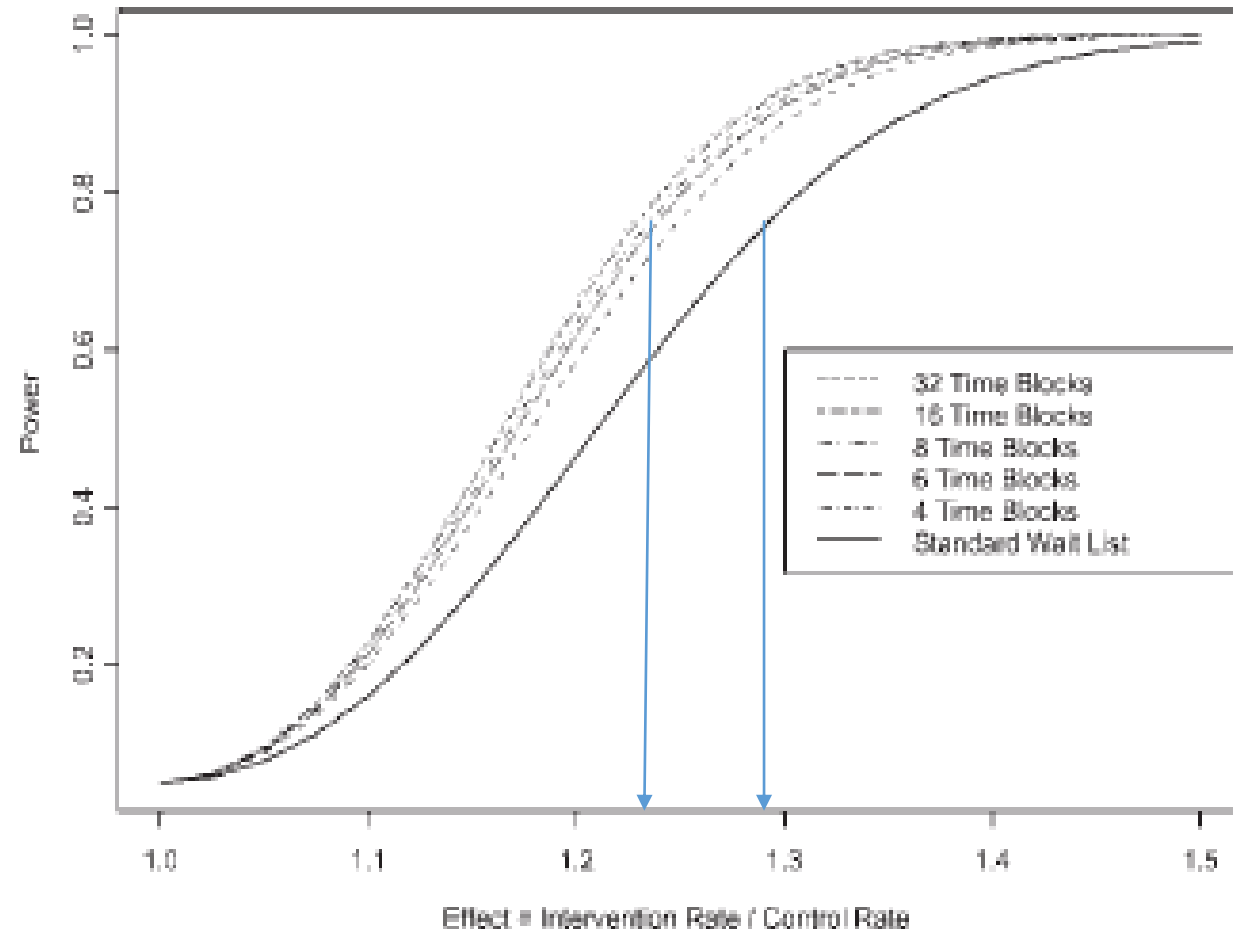
# 3. Roll-Out Design and Analysis Choices

- More Efficient allocation of 32 Schools than a Standard Wait-Listed Design

Year	Time Block	Wait-Listed Design		Dynamic Wait-Listed Design	
		Intervention	Wait-Listed	Intervention	Wait-Listed
1	1	16	16	4	28
	2			8	24
	3			12	20
	4			16	16
2	5	32	0	20	12
	6			24	8
	7			28	4
	8			32	0

Schools Blocked Into 8 Equivalent Groups of 4 who are trained in the same Quarter year

# Power increases with even a few subregions



**Figure 6** Statistical power for estimating intervention effect on increasing referrals for suicidality with a dynamic wait-listed design begun in the second phase of the Georgia gate-keeper project

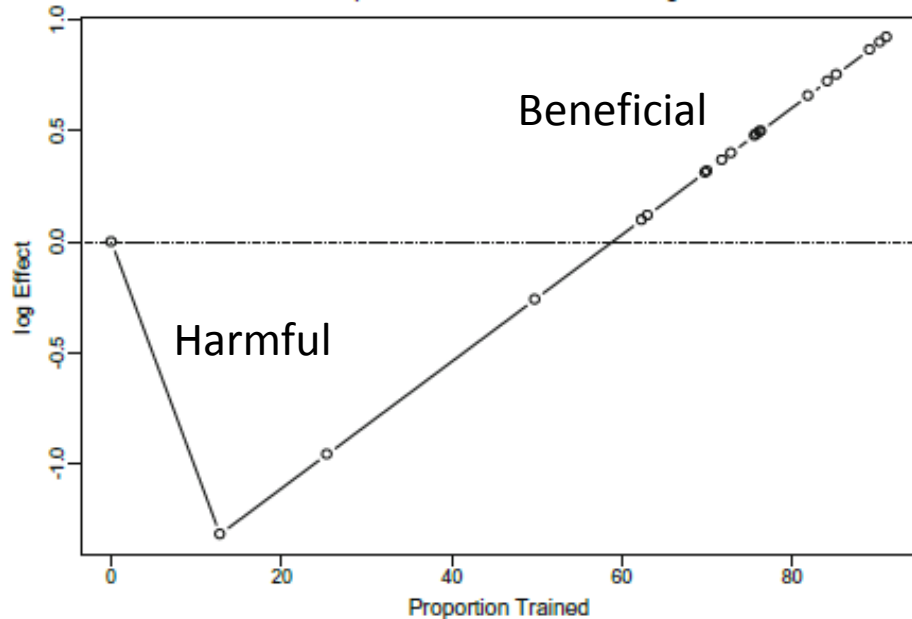
# Analyses

Model time as a systematic + random effect

Model Sub as a random effect

Model Intervention as fixed, potentially varying in duration

Effect of Proportion Trained on Referral in High School

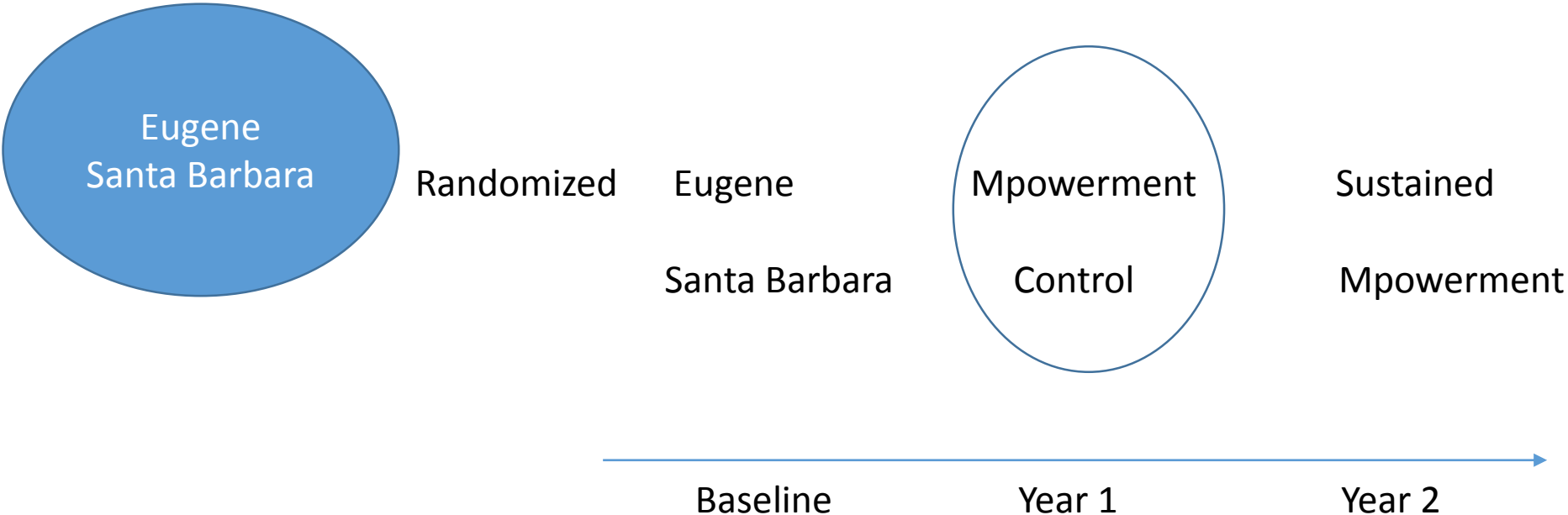


Wyman et al. Prev Sci 2015

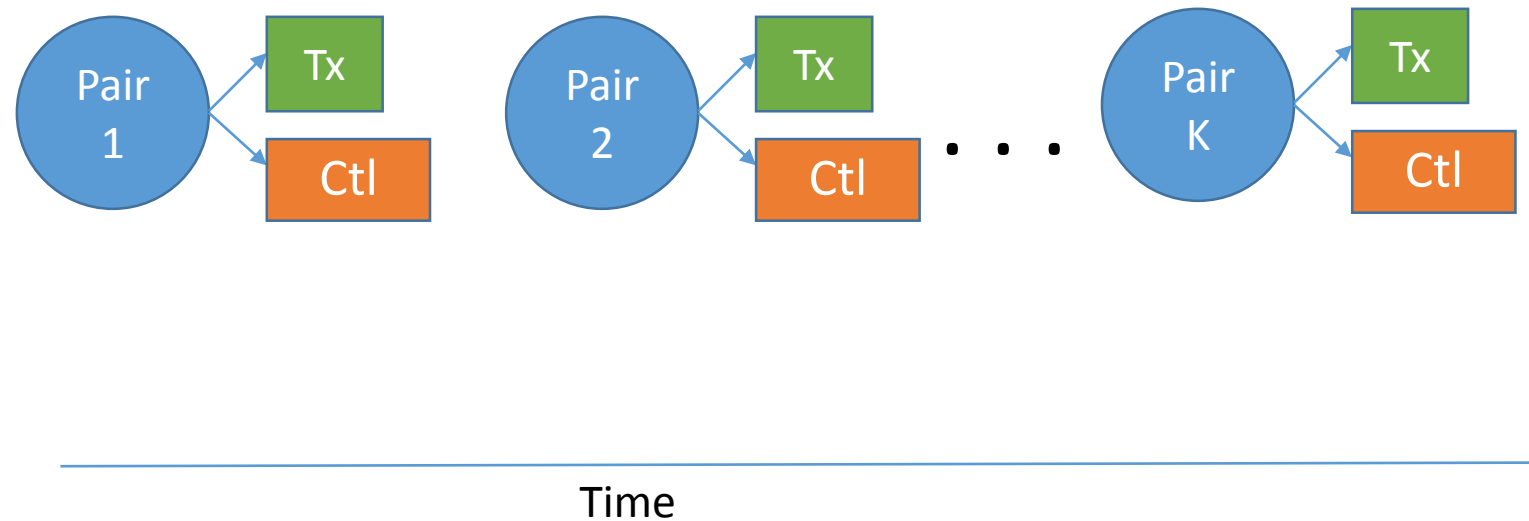
# Advantages Even with a Few Units to Randomize

N = 2

Mpowerment Young MSM (Kegeles AJP 1987)

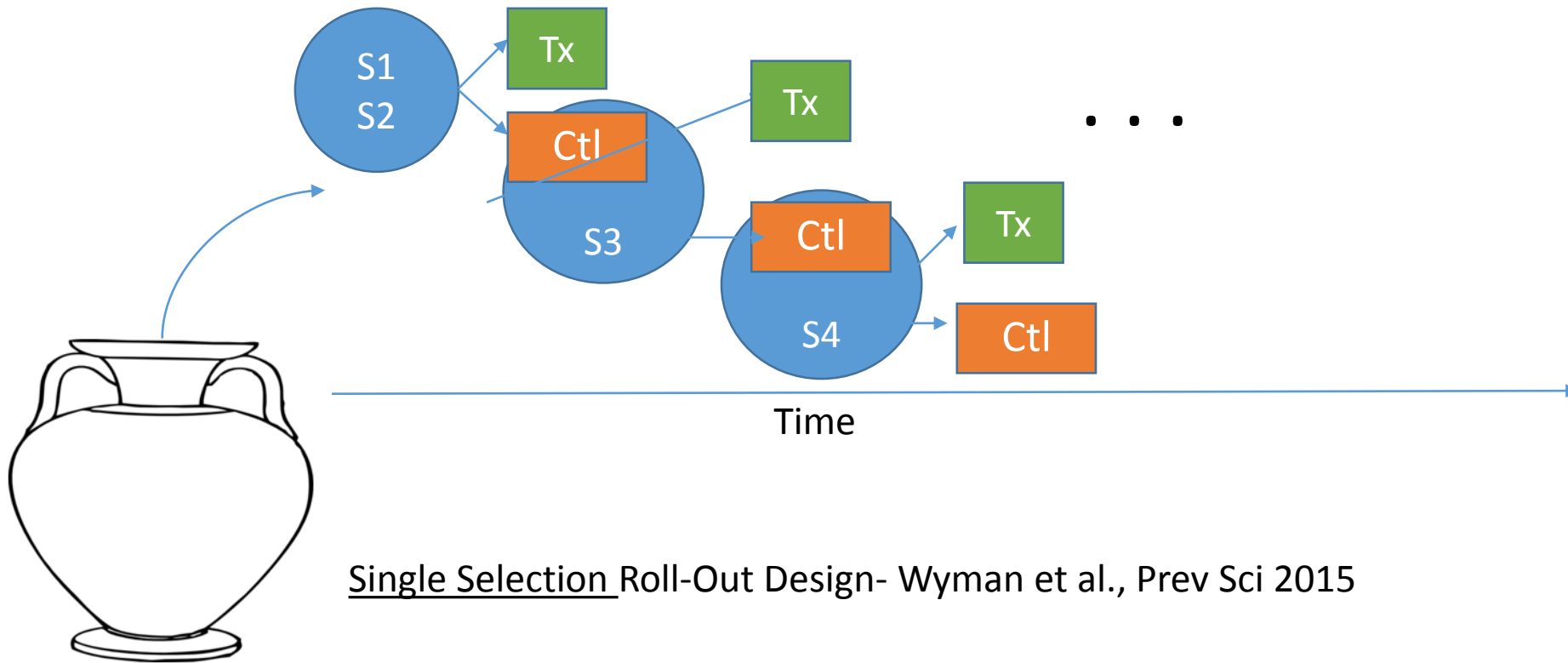


# Rollout of Repeated Pairs of Randomized Communities: Cumulative Trials (Brown et al., Ann Rev PH 2009)



Pairwise Enrollment Roll-Out Design- Wyman et al., Prev Sci 2015

# Single Selection Roll-Out of Randomly Selected Communities



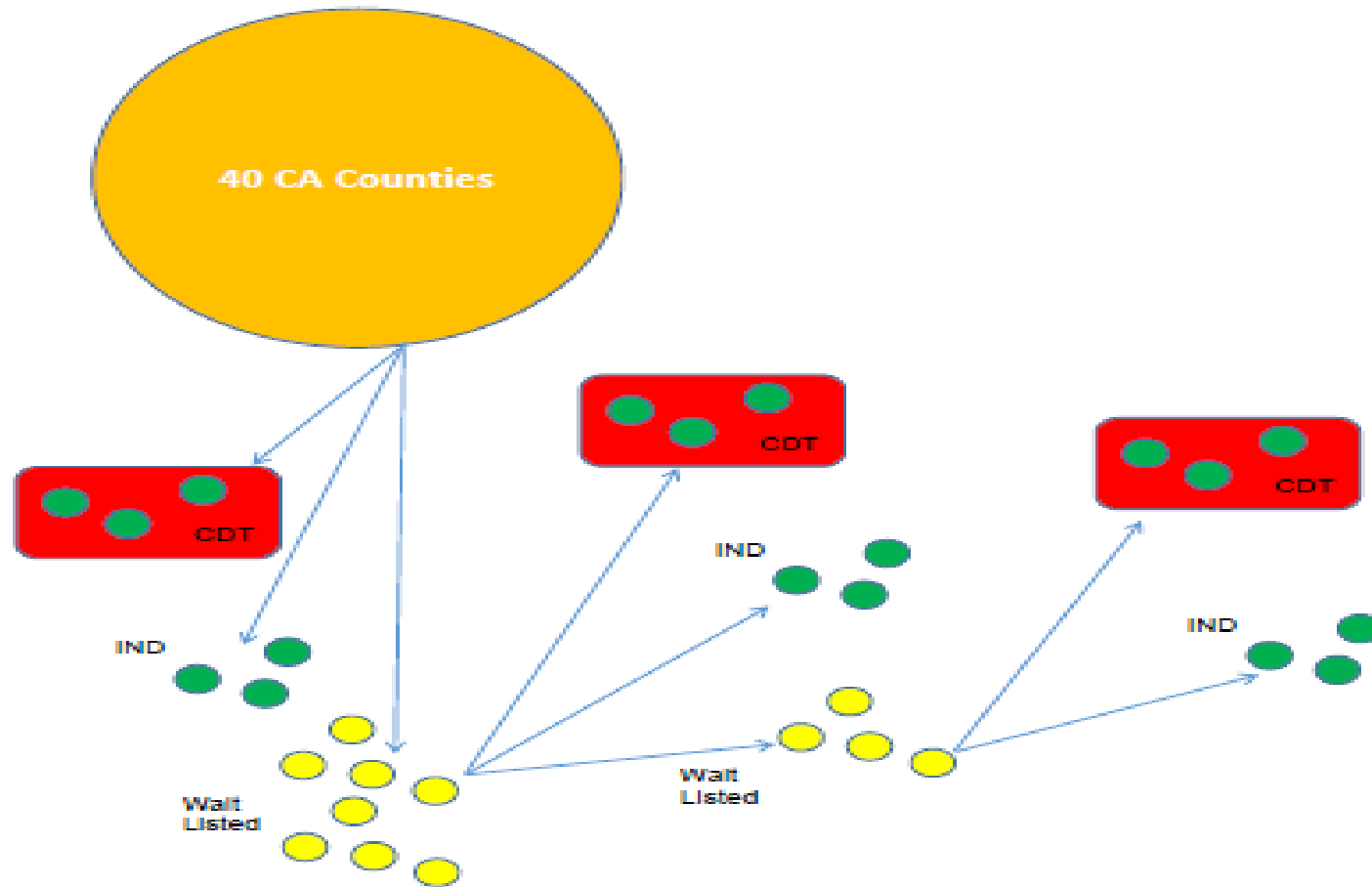
Single Selection Roll-Out Design- Wyman et al., Prev Sci 2015

# Head-to-Head Roll-Out Designs (Brown et al., in press Ann Rev PH)

Time	1	2	3	4
Cohort A	0	X*	X	X
	0	Y*	Y	Y
Cohort B	0	0	X*	X
	0	0	Y*	Y
Cohort C	0	0	0	X*
	0	0	0	Y*



# Comparison of Community Development Team (CDT) or Independent (Ind) Implementation Strategies (Brown et al., Imp Sci 2014)



# 4. Summary and References

1. With our limited set of evidence-based community and preventive interventions, especially to address health disparities, **we need to emphasize rigorous evaluation of home-grown programs.**
2. Roll-Out Designs are often appropriate
  - Policy Maker or Community Leaders: Ethically get out potentially valuable program
  - Researcher: Rigorous and efficient design allowing strong causal inferences
3. A Bestiary of Roll-Out Designs possible



SEA-GOD, SCYLLA

# References

Brown CA & Lilford RJ (2006). The stepped wedge trial design: A systematic review. *BMC Med Res Methodol* 6: 54.

Brown, C.H., Chamberlain, P., Saldana, L., Padgett, C., Wang W., Cruden G. (2014). Evaluation of two implementation strategies in fifty-one child county public service systems in two states: Results of a cluster randomized head-to-head implementation trial.

Brown CH, Curran G, Palinkas LA, Aarons GA, Wells KB, Jones L, Collins LM, Duan N, Mittman BS, Wallace A, Tabak RG, Ducharme L, Chambers D, Neta G, Wiley T, Landsverk J, Cheung K, Cruden G (in press). An Overview of Research and Evaluation Designs for Dissemination and Implementation. To appear in *Annual Rev Public Health*.

Brown, C. H., Ten Have, T. R., Jo, B., Dagne, G., Wyman, P. A., Muthén, B. O., & Gibbons, R. (2009). Adaptive designs in public health. *Annual Review Public Health*, 30, 1–25.

Brown CH, Wyman PA, Brinales JM, Gibbons RD. The role of randomized trials in testing interventions for the prevention of youth suicide. *International Review of Psychiatry*. Dec 2007;19(6):617-631.

Brown C.H., Wyman P. A., Guo J, and Peña J. (2006). Dynamic wait-listed designs for randomized trials: New designs for prevention of youth suicide. *Clinical Trials*, 3, 259-271

# References

- Chamberlain, P., Saldana, L., Brown, C. H., & Leve, L. (2010). Implementation of multidimensional treatment foster care in California: A randomized control trial of an evidence-based practice. In M. Roberts-DeGennaro & S. Fogel (Eds.), *Using evidence to inform practice for community and organizational change* (pp. 218–234). Chicago: Lyceum Books.
- Gambia Hepatitis Study Group: The Gambia Hepatitis Intervention Study. *Cancer Research* 1987, 47:5782-5787.
- Kegeles, S. M., Hays, R. B., & Coates, T. J. (1996). The Mpowerment Project: A community level HIV prevention intervention for young gay men. *American Journal of Public Health*, 86, 1129–1136.
- Sanson-Fisher RW, D'Este CA, Carey ML, Noble N, Paul CL. Evaluation of systems-oriented public health interventions: alternative research designs. *Annual review of public health*. 2014 Mar 18;35:9-27.
- Wyman, PA., Henry, D., Knoblauch, S., & Brown, CH. (2015). Designs for testing group-based interventions with limited numbers of social units: The dynamic wait-listed and regression point displacement designs. *Prevention Science*, 16(7), 956-966.