

# Large-Scale Evidence Generation and Evaluation in a Network of Databases (LEGEND)

Patrick Ryan, Martijn Schuemie, Marc Suchard on behalf of the LEGEND team OHDSI Symposium 12 October 2018

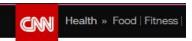


## OHDSI's mission

To improve health by empowering a community to collaboratively generate the evidence that promotes better health decisions and better care

## The New Hork Times

## TheUpshot



THE NEW HEALTH CARE

## Nearly ha Why New Blood Pressure blood pre Guidelines Could Lead to Harm

(1) Up

Fear is typically not effective in getting people to adopt healthier habits. A more likely outcome is overtreatment.





By Aaron E. Carroll



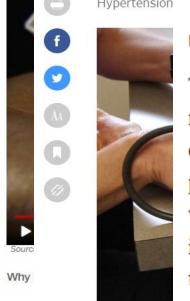












The potential upside from this change is that because of "awareness," more people might make lifestyle changes that lead to lower cardiovascular risk in the future. The potential downside is that more people may receive a diagnosis of high blood pressure, be overtreated with medication, and endure side effects or adverse outcomes. It's not irrational to fear that these new guidelines might lead to more of the latter than the former.



## What's in a guideline?

## Clinical Practice Guideline: Executive Summary

## 2017 ACC/AHA/AAPA/ABC/ACPM/AGS/APhA/ASH/ ASPC/NMA/PCNA Guideline for the Prevention, Detection, Evaluation, and Management of High Blood Pressure in Adults: Executive Summary

A Report of the American College of Cardiology/American Heart Association Task Force on Clinical Practice Guidelines

#### WRITING COMMITTEE MEMBERS

Paul K. Whelton, MB, MD, MSc, FAHA, Chair; Robert M. Carey, MD, FAHA, Vice Chair;

Wilbert S. Aronow, MD, FACC, FAHA\*; Donald E. Casey, Jr, MD, MPH, MBA, FAHA†; Karen J. Collins, MBA‡;

Cheryl Dennison Himme

Samuel Gidding,

Eric J. MacLaughlin, PharmI Sidney C. Smith, Jr, M

Sandra J. Taler, MD, FAHA§§;

Jeff D. W

56 pages containing

**106** recommendations

na, MHS, PA-C, CLS, AACCI; W. Jones, MD, FAHA†; e, MD, MSc, MAS, MBA, FAHA†; ndall S. Stafford, MD, PhD‡‡; A. Williams, Sr, MD, MACC, FAHA†; , PhD, FAHA##

#### ACC/AHA TASK FORCE MEMBERS

Glenn N. Levine, MD, FACC, FAHA, Chair; Patrick T. O'Gara, MD, FAHA, MACC, Chair-Elect; Jonathan L. Halperin, MD, FACC, FAHA, Immediate Past Chair; Sana M. Al-Khatib, MD, MHS, FACC, FAHA; Joshua A. Beckman, MD, MS, FAHA; Kim K. Birtcher, MS, PharmD, AACC; Biykem Bozkurt, MD, PhD, FACC, FAHA\*\*\*; Ralph G. Brindis, MD, MPH, MACC\*\*\*; Joaquin E. Cigarroa, MD, FACC; Lesley H. Curtis, PhD, FAHA\*\*\*; Anita Deswal, MD, MPH, FACC, FAHA; Lee A. Fleisher, MD, FACC, FAHA; Federico Gentile, MD, FACC; Samuel Gidding, MD, FAHA\*\*\*; Zachary D. Goldberger, MD, MS, FACC, FAHA; Mark A. Hlatky, MD, FACC, FAHA; John Ikonomidis, MD, PhD, FAHA; José A. Joglar, MD, FACC, FAHA; Laura Mauri, MD, MSc, FAHA; Susan J. Pressler, PhD, RN, FAHA\*\*\*; Barbara Riegel, PhD, RN, FAHA; Duminda N. Wijeysundera, MD, PhD



#### **CLASS (STRENGTH) OF RECOMMENDATION**

#### CLASS I (STRONG)

Benefit >>> Risk

Suggested phrases for writing recommendations:

- Is recommended
- Is indicated/useful/effective/beneficial
- Should be performed/administered/other
- Comparative-Effectiveness Phrases†:
  - Treatment/strategy A is recommended/indicated in preference to treatment B
  - · Treatment A should be chosen over treatment B

#### CLASS III (MODERATE

Benefit >> Rist

Suggested phrases for writing recommendations:

- Is reasonable
- Can be useful/effective/beneficial
- Comparative-Effectiveness Phrases†:
  - Treatment/strategy A is probably recommended/indicated in preference to treatment B
  - It is reasonable to choose treatment A over treatment B

#### CLASS IIb (WEAK)

Benefit ≥ Risk

Suggested phrases for writing recommendations:

- May/might be reasonable
- May/might be considered
- Usefulness/effectiveness is unknown/unclear/uncertain or not well established

### CLASS III: No Benefit (MODERATE)

Benefit = Risk

Suggested phrases for writing recommendations:

- Is not recommended
- Is not indicated/useful/effective/beneficial
- · Should not be performed/administered/other

#### CLASS III: Harm (STRONG)

Risk > Benefit

Suggested phrases for writing recommendations:

- Potentially harmful
- Causes harm
- Associated with excess morbidity/mortality
- · Should not be performed/administered/other

### LEVEL (QUALITY) OF EVIDENCE‡

#### LEVEL A

- High-quality evidence‡ from more than 1 RCT
- · Meta-analyses of high-quality RCTs
- One or more RCTs corroborated by high-quality registry studies

#### LEVEL B-R

(Randomized)

- Moderate-quality evidence‡ from 1 or more RCTs
- Meta-analyses of moderate-quality RCTs

#### **LEVEL B-NR**

(Nonrandomized)

- Moderate-quality evidence‡ from 1 or more well-designed, well-executed nonrandomized studies, observational studies, or registry studies
- Meta-analyses of such studies

#### LEVEL C-LO

(Limited Data)

- Randomized or nonrandomized observational or registry studies with limitations of design or execution
- Meta-analyses of such studies
- Physiological or mechanistic studies in human subjects

#### LEVEL C-EO

(Expert Opinion)

Consensus of expert opinion based on clinical experience

COR and LOE are determined independently (any COR may be paired with any LOE).

A recommendation with LOE C does not imply that the recommendation is weak. Many important clinical questions addressed in guidelines do not lend themselves to clinical trials. Although RCTs are unavailable, there may be a very clear clinical consensus that a particular test or therapy is useful or effective.

- \* The outcome or result of the intervention should be specified (an improved clinical outcome or increased diagnostic accuracy or incremental prognostic information).
- † For comparative-effectiveness recommendations (COR I and IIa; LOE A and B only), studies that support the use of comparator verbs should involve direct comparisons of the treatments or strategies being evaluated.
- ‡ The method of assessing quality is evolving, including the application of standardized, widely used, and preferably validated evidence grading tools; and for systematic reviews, the incorporation of an Evidence Review Committee.

COR indicates Class of Recommendation; EO, expert opinion; LD, limited data; LOE, Level of Evidence; NR, nonrandomized; R, randomized; and RCT, randomized controlled trial.



## 8.1.6. Choice of Initial Medication

## **Recommendation for Choice of Initial Medication**

References that support the recommendation are summarized in Online Data Supplement 27 and Systematic Review Report.

COR	LOE	Recommendation		
I	<b>A</b> <sup>SR</sup>	1. For initiation of antihypertensive drug therapy, first-line agents include thiazide diuretics, CCBs, and ACE inhibitors or ARBs. S8.1.6-1,S8.1.6-2		

SR indicates systematic review.

Whelton et al., Hypertension 2018



Table 18. Oral Antihypertensive Drugs

ER (various

onset

forms)

Class	Drug	Usual Dose, Range (mg/d)*	Daily Frequency	Comments
Primary agents	<u> </u>			
Thiazide or	Chlorthalidone	12.5-25	1	Chlorthalidone is preferred on the basis of
thiazide-type	Hydrochlorothiazide	25-50	1	prolonged half-life and proven trial reduction of
diuretics	Indapamide	1.25-2.5	1	CVD.
4	Metolazone	2.5–10	1	Monitor for hyponatremia and hypokalemia, uric acid and calcium levels.     Use with caution in patients with history of acute gout unless patient is on uric acid—lowering therapy.
ACE inhibitors	Benazepril	10-40	1 or 2	Do not use in combination with ARBs or direct renin
	Captopril	12.5-150	2 or 3	inhibitor.
	Enalapril	5-40	1 or 2	There is an increased risk of hyperkalemia, especially
	Fosinopril	10-40	1	in patients with CKD or in those on K+ supplements
10	Lisinopril	10-40	1	or K+-sparing drugs.
(10)	Moexipril	7.5-30	1 or 2	There is a risk of acute renal failure in patients with
	Perindopril	4-16	1	severe bilateral renal artery stenosis.
	Quinapril	10-80	1 or 2	Do not use if patient has history of angioedema with
	Ramipril	2.5-10	1 or 2	ACE inhibitors.
	Trandolapril	1-4	1	Avoid in pregnancy.     Only 29 different
ARBs	Azilsartan	40-80	1	Do not use in combination with ACF inh
	Candesartan	8-32	1	direct renin inhibitor. drugs in
	Eprosartan	600-800	1 or 2	
	Irbesartan	150-300	1	in those on K <sup>+</sup> supplements or K <sup>+</sup> different classes
(8)	Losartan	50-100	1 or 2	There is a risk of acute renal failure in patient to choose from!
	Olmesartan	20-40	1	severe bilateral renal artery stenosis.
	Telmisartan	20-80	1	Do not use if patient has history of angioedem
TI	Valsartan	80-320	1	with ARBs. Patients with a history of angioedema with an ACE inhibitor can receive an ARB beginning 6 weeks after ACE inhibitor is discontinued  • Avoid in pregnancy.
CCB-	Amlodipine	2.5-10	1	Avoid use in patients with HFrEF;     Distinguished from 28
dihydropyridin	Felodipine	5-10	1	felodipine may be used if required
es	Isradipine	5-10	2	They are associated with dose-religious drugs in 12 other classes
	Nicardipine SR	5-20	1	which is more common in women
(5)	Nifedipine LA	60-120	1	that are classified as
	Nisoldipine	30-90	1	
CCB—	Diltiazem SR	180-360	2	Avoid routine use with beta block     potential secondary agents
nondihydropyri	Diltiazem ER	120-480	1	increased risk of bradycardia and h (including Beta Blockers)
dines	Verapamil IR	40-80	3	Do not use in patients with HFrEF.
	Verapamil SR	120-480	1 or 2	There are drug interactions with diltiazem and
2	Verapamil-delayed	100-480	1 (in the	verapamil (CYP3A4 major substrate and moderate Whelton et al.,

inhibitor).

evening)

Whelton et al., Hypertension 2018 7



## How are patients with hypertension *ACTUALLY* treated in the real world?

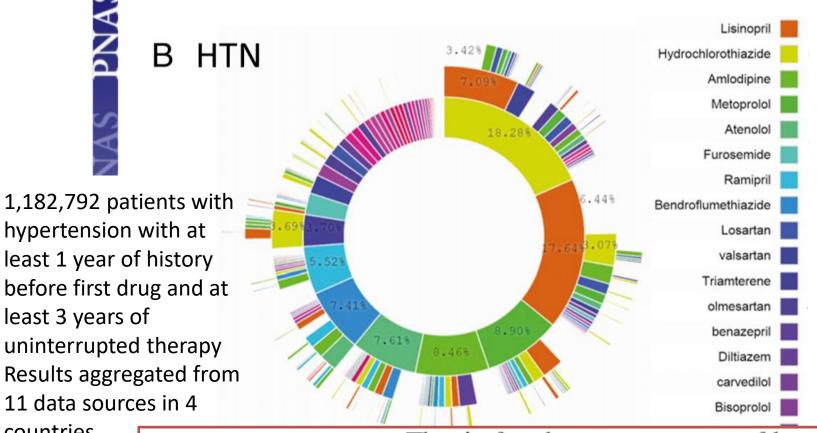


countries



## Characterizing treatment pathways at scale using the OHDSI network

George Hripcsak<sup>a,b,c,1</sup>, Patrick B. Ryan<sup>c,d</sup>, Jon D. Duke<sup>c,e</sup>, Nigam H. Shah<sup>c,f</sup>, Rae Woong Park<sup>c,g</sup>, Vojtech Huser<sup>c,h</sup>,

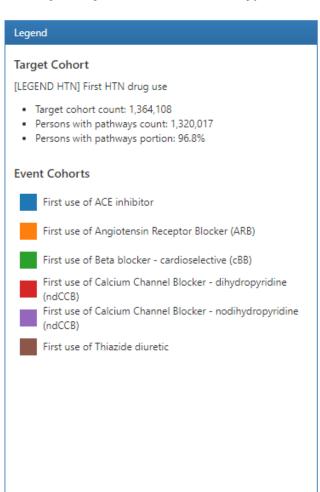


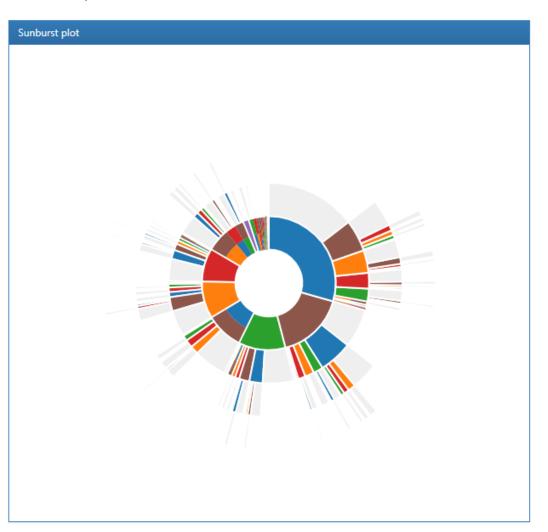
That is, for almost one quarter of hypertension patients, the response to the question, "In an underlying population of 250 million, based on my 3-y treatment pathway, what patients are like me?" would be "No one."



## New capability in ATLAS: Cohort pathway!

Pathways Analysis for [LEGEND HTN] Hypertension treatment sequence

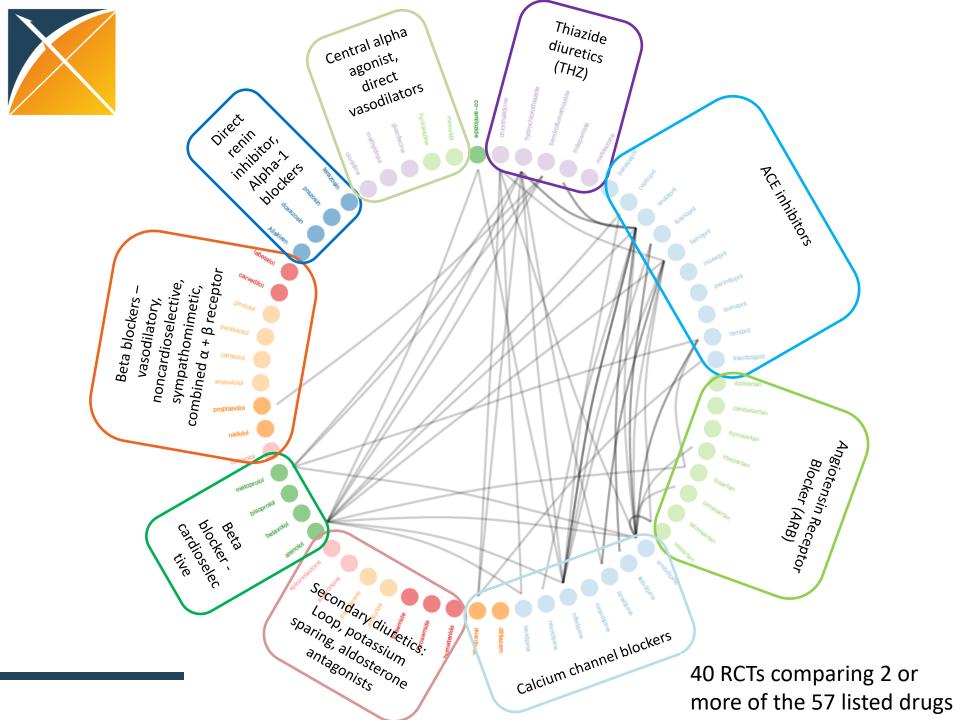






## For initiation of antihypertensive drug therapy, how *SHOULD* patients be treated?

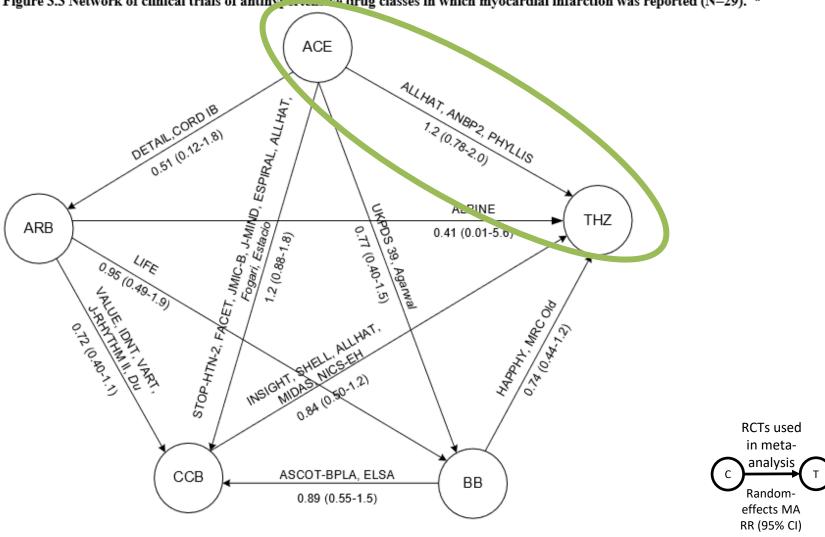
What evidence do we have about the comparative effects about alternative antihypertensive drugs?





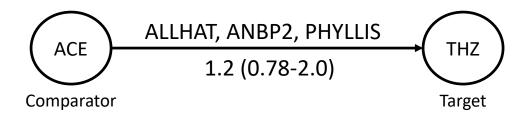
## RCT evidence about comparative effectiveness for myocardial infarction

Figure 3.3 Network of clinical trials of antihymetic size drug classes in which myocardial infarction was reported (N=29). \*





## Dissecting the comparative evidence of ACE vs THZ on AMI



		Target			Comparator		
Study	Population	Drug	Exposed	Events	Drug	Exposed	Events
	Prior (treated) stage 1/2						
	hypertension with >=1						
ALLHAT	CVD risk factor	Chlorthalidone	15,255	1,362	Lisinopril	9,054	796
	Australians aged 65-84						
	with SBP > 160mmHg						
ANBP2	(62% previously treated)	Hydrochlorothiazide	3,039	82	Enalapril	3,044	58
	Italians age 45-70 with						
	hypertension and						
PHYLLIS	hypercholesterolemia	Hydrochlorothiazide	127	3	Fosinopril	127	-

Effect estimate					
RR		LB95CI	UB95CI		
	1.01	0.93	1.10		
	1.47	1.02	2.13		
	not reported				





American Journal of Epidemiology

© The Author 2016, Published by Oxford University Press on behalf of the Johns Hopkins Bloomberg School of Public Health, All rights reserved. For permissions, please e-mail; journals.permissions@oup.com.

Vol. 183, No. 8 DOI: 10.1093/aje/kwv254 Advance Access publication: March 18, 2016

### Practice of Epidemiology

### Using Big Data to Emulate a Target Trial When a Randomized Trial Is Not Available

### Miguel A. Hernán\* and James M. Robins

\* Correspondence to Dr. Miguel A. Hernán, Department of Epidemiology, 677 Huntington Avenue, Boston, MA 02115 (e-mail: miguel\_hernan@post.harvard.edu).

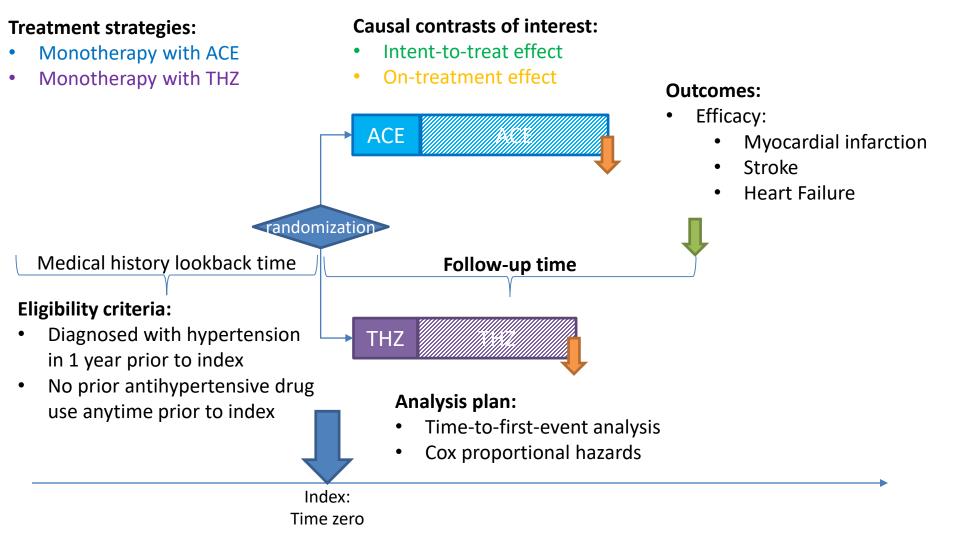
Initially submitted December 9, 2014; accepted for publication September 8, 2015.

Ideally, questions about comparative effectiveness or safety would be answered using an appropriately designed and conducted randomized experiment. When we cannot conduct a randomized experiment, we analyze observational data. Causal inference from large observational databases (big data) can be viewed as an attempt to emulate a randomized experiment—the target experiment or target trial—that would answer the question of interest. When the goal is to guide decisions among several strategies, causal analyses of observational data need to be evaluated with respect to how well they emulate a particular target trial. We outline a framework for comparative effectiveness research using big data that makes the target trial explicit. This framework channels counterfactual theory for comparing the effects of sustained treatment strategies, organizes analytic approaches, provides a structured process for the criticism of observational studies, and helps avoid common methodologic pitfalls.

big data; causal inference; comparative effectiveness research; target trial

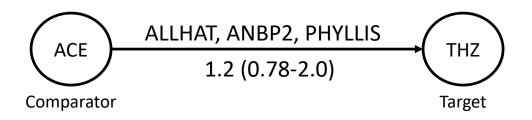


## What would the 'target trial' look like to compare efficacy of two initial therapies?





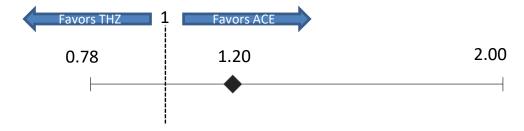
# What if we assumed the current evidence came from RCTs that were close enough to the 'target trial'?





## Interpreting uncertainty



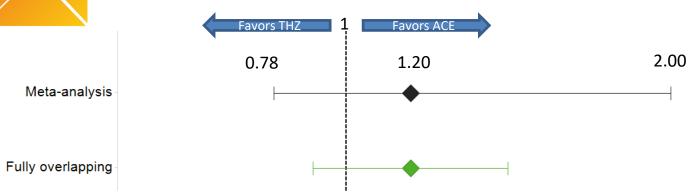


- 1) Stand up if you think this estimate shows no statistically significant difference.
  - 2) Sit down if you think this estimate suggests the expected average treatment effect is 20% increased risk for TZD.
    - 3) Raise your left hand if you think this estimate suggest the risk associated with TZD vs. ACE could be as large as 100% increase (RR=2).
      - 4) Raise your right hand if you think this estimate suggest the risk associated with TZD vs. ACE could be as large as 28% decrease (RR=0.78).





## Evaluating concordance between estimates

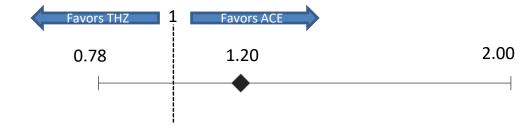




Meta-analysis

0.40

## Interpreting uncertainty



Would this estimate be concordant with RCT meta-analysis?

How would it be interpreted? Would this estimate be concordant with RCT meta-analysis?

How would it be interpreted? Would this estimate be concordant with RCT meta-

analysis?

How would it be interpreted?

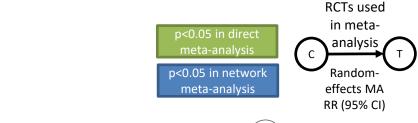
Would this estimate be concordant with RCT meta-analysis?
How would it be interpreted?

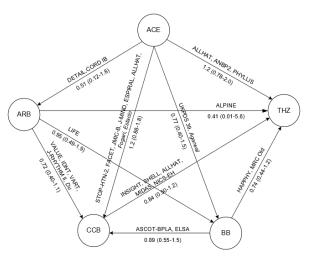
2.00 2.20 2.40

0.60 0.80 1.00 1.20 1.40 1.60 1.80 Relative risk of Acute myocardial infarction



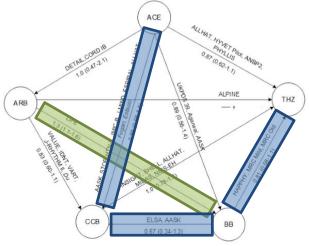
## RCT evidence about comparative effectiveness for cardiovascular outcomes





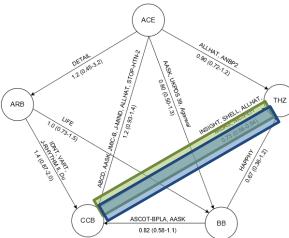
**Myocardial infarction** 

• 8/10 DMA comparisons cannot rule out possibility of 2x risk



• 1/10 DMA comparisons cannot rule out possibility of 2x risk

**Stroke** 



**Heart failure** 

 4/10 DMA comparisons cannot rule out possibility of 2x risk



8.1.6.1. Choice of Initial Monotherapy Versus Initial Combination Drug Therapy

## Recommendations for Choice of Initial Monotherapy Versus Initial Combination Drug Therapy\*

COR	LOE	Recommendations		
ı	C-EO	Initiation of antihypertensive drug therapy with 2 first-line agents of different classes, either as separate agents or in a fixed-dose combination, is recommended in adults with stage 2 hypertension and an average BP more than 20/10 mm Hg above their BP target.		
		C .		

# Ila C-EO

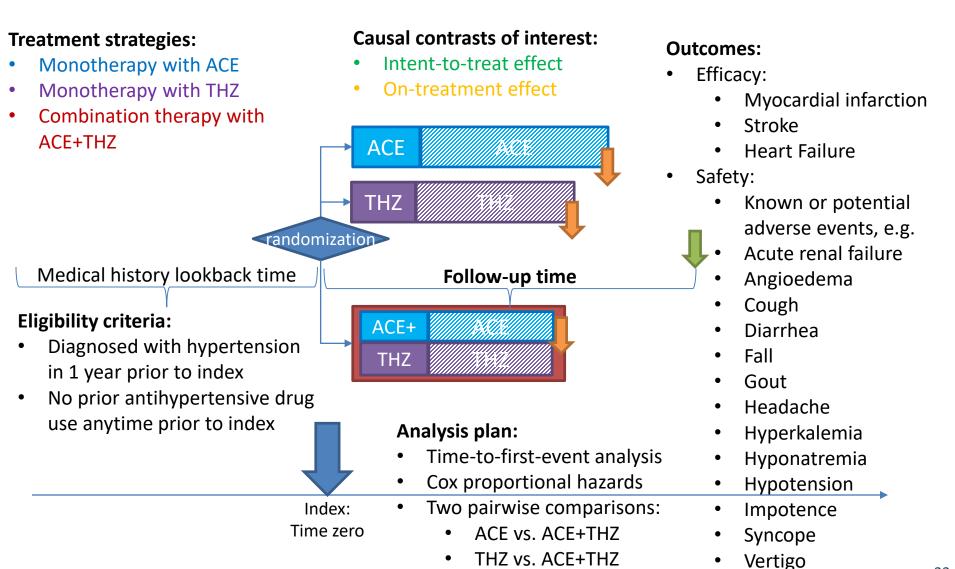
\*Fixed-dose combinate Data Supplement D.

## **Synopsis**

Systematic review of the evidence comparing the initiation of antihypertensive treatment with monotherapy and sequential (stepped-care) titration of additional agents versus initiation of treatment with combination therapy (including fixed-dose combinations) did not identify any RCTs meeting the systematic review questions posed in the PICOTS format (P=population, I=intervention, C=comparator, O=outcome, T=timing, S=setting). However, in both ACCORD and SPRINT, 2-drug therapy was recommended for most participants in the intensive- but not standard-therapy groups.



## What would the 'target trial' look like to compare mono vs combination therapy?





## Are drugs within the same class truly equivalent?



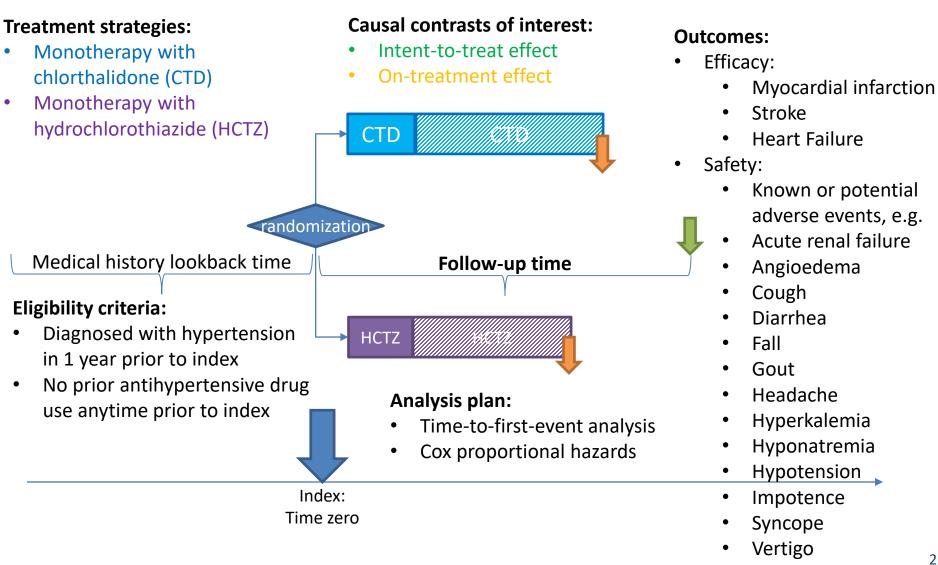
Table 18. Oral Antihypertensive Drugs

Class	Drug	Usual Dose, Range (mg/d)*	Daily Frequency		Comments
Primary agents					
Thiazide or	Chlorthalidone	12.5-25	1	•	Chlorthalidone is preferred on the basis of
thiazide-type	Hydrochlorothiazide	25-50	1		prolonged half-life and proven trial reduction of
diuretics	Indapamide	1.25-2.5	1		CVD.
	Metolazone	2.5-10	1	<b>!-</b>	Manitor for hungastromis and hungkalamia usis
					acid and calcium levels.
				•	ose min council in ponents min motor, or counc
				┺	gout unless patient is on uric acid-lowering therapy.
ACE inhibitors	Benazepril	10-40	1 or 2	ս	Do not use in combination with ARBs or direct renin
	Captopril	12.5-150	2 or 3	4	inhibitor.
	Enalapril	5-40	1 or 2	ս •	There is an increased risk of hyperkalemia, especially
	Fosinopril	10-40	1	1	in patients with CKD or in those on K+ supplements
	Lisinopril	10-40	1	4	or K+-sparing drugs.
	Moexipril	7.5–30	1 or 2	ս •	There is a risk of acute renal failure in patients with
	Perindopril	4–16	1	1	severe bilateral renal artery stenosis.
	Quinapril	10-80	1 or 2	լ•	Do not use if patient has history of angioedema with
	Ramipril	2.5-10	1 or 2	1	ACE inhibitors.
	Trandolapril	1-4	1	լ•	Avoid in pregnancy.
ARBs	Azilsartan	40-80	1	ս •	Do not use in combination with ACE inhibitors or
	Candesartan	8-32	1	1	direct renin inhibitor.
	Eprosartan	600-800	1 or 2	լ •	There is an increased risk of hyperkalemia in CKD or
	Irbesartan	150-300	1	1	in those on K+ supplements or K+-sparing drugs.
	Losartan	50-100	1 or 2	ս •	There is a risk of acute renal failure in patients with
	Olmesartan	20-40	1	4	severe bilateral renal artery stenosis.
	Telmisartan	20-80	1	١.	Do not use if patient has history of angioedema
	Valsartan	80-320	1	Ш	with ARBs. Patients with a history of angioedema with an ACE inhibitor can receive an ARB beginning 6
				Г	weeks after ACE inhibitor is discontinued.
				١.	Avoid in pregnancy.
CCB—	Amlodipine	2.5-10	1	-	Avoid use in patients with HFrEF; amlodipine or
dihydropyridin	Felodipine	5-10	1	1	felodipine may be used if required.
es	Isradipine	5-10	2	↿.	They are associated with dose-related pedal edema,
	Nicardipine SR	5-20	1	1	which is more common in women than men.
	Nifedipine LA	60-120	1	1	
	Nisoldipine	30-90	1	1	
CCB-	Diltiazem SR	180-360	2	١.	Avoid routine use with beta blockers because of
nondihydropyri	Diltiazem ER	120-480	1	1	increased risk of bradycardia and heart block.
dines	Verapamil IR	40-80	3	↿.	Do not use in patients with HFrEF.
	Verapamil SR	120-480	1 or 2	┧.	
	Verapamil-delayed	100-480	1 (in the	1	verapamil (CYP3A4 major substrate and moderate
	onset ER (various		evening)		inhibitor).
	forms)			1	

Whelton et al., Hypertension 2018<sup>25</sup>



## What would the 'target trial' look like to compare efficacy of two initial therapies?





## Diuretic Comparison Project (DCP)





## What is the Diuretic Comparison Project study design?

### **Treatment strategies:**

- Monotherapy with chlorthalidone (CTD)
- Monotherapy with hydrochlorothiazide (HCTZ)

#### **Causal contrasts of interest:**

Intent-to-treat effect



#### **Outcomes:**

- Myocardial infarction
- Stroke
- Hospitalization for **Heart Failure**

th

tion

Coronary

What can we learn now from observational data while we wait 4 years for this RCT to be completed?

Me

### **Eligibility criteria:**

- Age >= 65
- Diagnosed with hypertension
- Currently treated with hydrochlorothiazide
- Potassium/sodium imbalance
- Death expected in 6 months

**HCTZ** 

### **Analysis plan:**

- Time-to-first-event analysis
- Cox proportional hazards

**Estimated enrollment:** 

13,500

**Study start:** 

June2016

**Estimated completion:** 

Oct2022

Index: Time zero



## Summarizing the opportunity

- Many different opportunities to generate observational evidence that could promote better health decisions and better care
  - Confirm LOE-A evidence in 'real world'
  - Improve the level of evidence for 'C-EO' recommendations
  - Enable greater specificity in guidelines, based on both comparative effectiveness and safety
  - Reduce uncertainty and fill gaps in our existing knowledge
- But first, we need to prove that observational evidence can be considered reliable enough to be used to inform decision-making
  - Doing so requires fundamentally re-thinking how observational evidence is generated, evaluated, and disseminated