

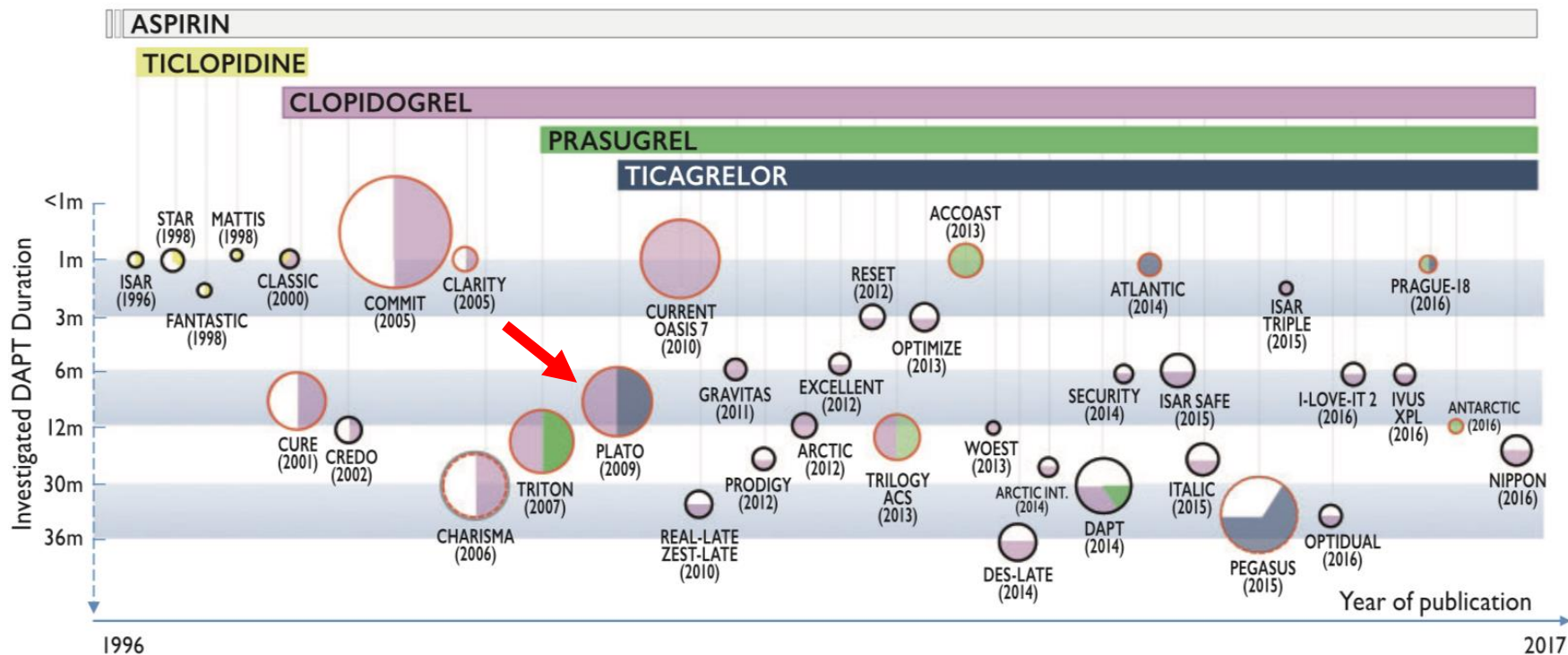


Global collaborative research through OHDSI  
network:

# Net Adverse Clinical Event between Ticagrelor and Clopidogrel in patients with Acute Coronary Syndrome

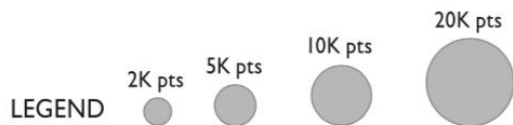
Seng Chan You; YeonSook Rho; Jiwoo Kim; Jaehyeong Cho; Jimyung Park; Anastasios Siapos; Ajit Londhe; Rae Woong Park; Harlan M. Krumholz

# History of Dual AntiPlatelet Therapy (DAPT) in patients with coronary artery disease



Size of the circles denotes sample size

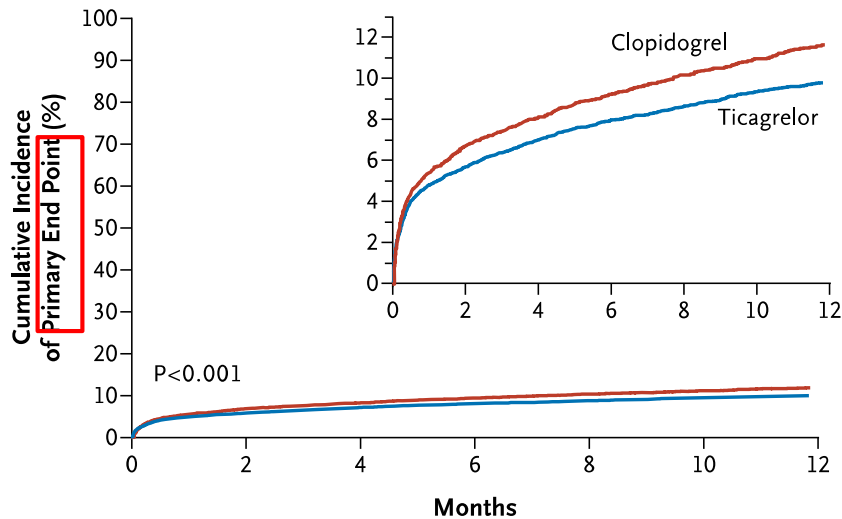
Perimeter of the circles denotes type of investigated population



- Mixed clinical presentation at the time of stent implantation
- Acute coronary syndrome at presentation
- DAPT initiated in patients with prior myocardial infarction
- DAPT for primary prevention



# PLATelet inhibition and patient Outcomes (PLATO) Trial



No. at Risk							
Ticagrelor	9333	8628	8460	8219	6743	5161	4147
Clopidogrel	9291	8521	8362	8124	6650	5096	4047

End Point	Ticagrelor Group	Clopidogrel Group	Hazard or Odds Ratio for Ticagrelor Group (95% CI) <sup>†</sup>	P Value
Primary safety end points — no./total no. (%)				
Major bleeding, study criteria	961/9235 (11.6)	929/9186 (11.2)	1.04 (0.95–1.13)	0.43
Major bleeding, TIMI criteria <sup>‡</sup>	657/9235 (7.9)	638/9186 (7.7)	1.03 (0.93–1.15)	0.57
Bleeding requiring red-cell transfusion	818/9235 (8.9)	809/9186 (8.9)	1.00 (0.91–1.11)	0.96
Life-threatening or fatal bleeding, study criteria	491/9235 (5.8)	480/9186 (5.8)	1.03 (0.90–1.16)	0.70
Fatal bleeding	20/9235 (0.3)	23/9186 (0.3)	0.87 (0.48–1.59)	0.66
Nonintracranial fatal bleeding	9/9235 (0.1)	21/9186 (0.3)		0.03
Intracranial bleeding	26/9235 (0.3)	14/9186 (0.2)	1.87 (0.98–3.58)	0.06
Fatal	11/9235 (0.1)	1/9186 (0.01)		0.02
Nonfatal	15/9235 (0.2)	13/9186 (0.2)		0.69
Secondary safety end points — no./total no. (%)				
Non-CABG-related major bleeding, study criteria	362/9235 (4.5)	306/9186 (3.8)	1.19 (1.02–1.38)	0.03
Non-CABG-related major bleeding, TIMI criteria	221/9235 (2.8)	177/9186 (2.2)	1.25 (1.03, 1.53)	0.03
CABG-related major bleeding, study criteria	619/9235 (7.4)	654/9186 (7.9)	0.95 (0.85–1.06)	0.32
CABG-related major bleeding, TIMI criteria	446/9235 (5.3)	476/9186 (5.8)	0.94 (0.82–1.07)	0.32
Major or minor bleeding, study criteria	1339/9235 (16.1)	1215/9186 (14.6)	1.11 (1.03–1.20)	0.008
Major or minor bleeding, TIMI criteria <sup>‡</sup>	946/9235 (11.4)	906/9186 (10.9)	1.05 (0.96–1.15)	0.33
Dyspnea — no./total no. (%)				
Any	1270/9235 (13.8)	721/9186 (7.8)	1.84 (1.68–2.02)	<0.001
Requiring discontinuation of study treatment	79/9235 (0.9)	13/9186 (0.1)	6.12 (3.41–11.01)	<0.001

Primary End Point: Vascular death, myocardial infarction and stroke

Wallentin et al., *NEJM*, 2009



# PLATelet inhibition and patient Outcomes (PLATO) Trial

	Ticagrelor Group	Clopidogrel Group
Race — no./total no. (%)‡		
White	8566/9332 (91.8)	8511/9291 (91.6)
Black	115/9332 (1.2)	114/9291 (1.2)
Asian	542/9332 (5.8)	554/9291 (6.0)
Other	109/9332 (1.2)	112/9291 (1.2)
Final diagnosis of ACS — no./total no. (%)		
ST-elevation MI	3496/9333 (37.5)	3530/9291 (38.0)
Non-ST-elevation MI	4005/9333 (42.9)	3950/9291 (42.5)
Unstable angina	1549/9333 (16.6)	1563/9291 (16.8)
Other diagnosis or missing data§	283/9333 (3.0)	248/9291 (2.7)
Risk factors for ST-elevation MI — no./total no. (%)		
Killip class >2	25/3496 (0.7)	41/3530 (1.2)
TIMI risk score ≥3	1584/3496 (45.3)	1553/3530 (44.0)



# Current clinical guideline for DAPT in ACS

Recommendations	Class <sup>a</sup>	Level <sup>b</sup>
<p>In <u>patients with ACS, ticagrelor (180 mg loading dose, 90 mg twice daily)</u> on top of aspirin<sup>c</sup> is recommended, regardless of initial treatment strategy, including patients pre-treated with clopidogrel (which should be discontinued when ticagrelor is commenced) unless there are contraindications.<sup>20</sup></p>	I	B

2017 ESC/EACTS DAPT guideline

## Recommendations for Specific P2Y<sub>12</sub> Inhibitors

COR	LOE	RECOMMENDATIONS
IIa	B-R	<p>In <u>patients with ACS (NSTEMI-ACS or STEMI)</u> treated with DAPT after coronary stent implantation and in patients with NSTEMI-ACS treated with medical therapy alone (without revascularization), <u>it is reasonable to use ticagrelor in preference to clopidogrel for maintenance P2Y<sub>12</sub> inhibitor therapy (53,71,72).</u></p>

2016 ACC/AHA DAPT guideline



# Ticagrelor might not be better than Clopidogrel in US

## Ticagrelor Compared With Clopidogrel by Geographic Region in the Platelet Inhibition and Patient Outcomes (PLATO) Trial

Kenneth W. Mahaffey, MD; Daniel M. Wojdyla, MS; Kevin Carroll, MS; Richard C. Becker, MD; Robert F. Storey, MD, DM; Dominick J. Angiolillo, MD, PhD; Claes Held, MD, PhD; Christopher P. Cannon, MD; Stefan James, MD, PhD; Karen S. Pieper, MS; Jay Horrow, MD; Robert A. Harrington, MD; Lars Wallentin, MD, PhD; on behalf of the PLATO Investigators

**Background**—In the Platelet Inhibition and Patient Outcomes (PLATO) trial, a prespecified subgroup analysis showed a significant interaction between treatment and region ( $P=0.045$ ), with less effect of ticagrelor in North America than in the rest of the world.



# Ticagrelor might not be better than Clopidogrel in US

**Table 2. Clinical Events Committee–Adjudicated Primary Efficacy End Points and Bleeding in the United States and the Rest of the World by Treatment**

End Point	Region	Ticagrelor (n=9333)			Clopidogrel (n=9291)			HR (95% CI)	P
		n	Patients With Events, n (%)	KM, %	n	Patients With Events, n (%)	KM, %		
Cardiovascular death/MI*/stroke	US	707	84 (11.9)	12.6	706	67 (9.5)	10.1	1.27 (0.92–1.75)	0.1459
	ROW	8626	780 (9.0)	9.6	8585	947 (11.0)	11.8	0.81 (0.74–0.90)	<0.0001
Cardiovascular death	US	707	24 (3.4)	3.7	706	19 (2.7)	2.7	<b>1.26 (0.69–2.31)</b>	0.4468
	ROW	8626	329 (3.8)	4.0	8585	423 (4.9)	5.3	0.77 (0.67–0.89)	0.0005
MI*	US	707	64 (9.1)	9.6	706	47 (6.7)	7.2	<b>1.38 (0.95–2.01)</b>	0.0956
	ROW	8626	440 (5.1)	5.5	8585	546 (6.4)	6.9	0.80 (0.70–0.90)	0.0004
Stroke	US	707	7 (1.0)	1.0	706	4 (0.6)	0.6	<b>1.75 (0.51–5.97)</b>	0.3730
	ROW	8626	118 (1.4)	1.5	8585	102 (1.2)	1.3	1.15 (0.88–1.50)	0.2964
All-cause mortality	US	707	28 (4.0)	4.2	706	24 (3.4)	3.6	<b>1.17 (0.68–2.01)</b>	0.5812
	ROW	8626	371 (4.3)	4.6	8585	482 (5.6)	6.1	0.77 (0.67–0.88)	0.0001
PLATO major bleeding	US	682	77 (11.3)	12.2	675	74 (11.0)	11.9	1.05 (0.76–1.45)	0.7572
	ROW	8553	884 (10.3)	11.5	8511	855 (10.1)	11.1	1.04 (0.94–1.14)	0.4696
PLATO non-CABG major bleeding	US	682	29 (4.3)	5.1	675	25 (3.7)	4.3	1.20 (0.70–2.04)	0.5115
	ROW	8553	333 (3.9)	4.4	8511	281 (3.3)	3.7	1.19 (1.01–1.39)	0.0330
PLATO major/minor bleeding	US	682	101 (14.8)	16.4	675	92 (13.6)	15.2	1.11 (0.84–1.48)	0.4599
	ROW	8553	1238 (14.5)	16.1	8511	1123 (13.2)	14.6	1.11 (1.02–1.20)	0.0114



# Ticagrelor might not be better than Clopidogrel in US

## Ticagrelor Compared With Clopidogrel by Geographic Region in the Platelet Inhibition and Patient Outcomes (PLATO) Trial

Kenneth W. Mahaffey, MD; Daniel M. Wojdyla, MS; Kevin Carroll, MS; Richard C. Becker, MD; Robert F. Storey, MD, DM; Dominick J. Angiolillo, MD, PhD; Claes Held, MD, PhD; Christopher P. Cannon, MD; Stefan James, MD, PhD; Karen S. Pieper, MS; Jay Horrow, MD; Robert A. Harrington, MD; Lars Wallentin, MD, PhD; on behalf of the PLATO Investigators

**Background**—In the Platelet Inhibition and Patient Outcomes (PLATO) trial, a prespecified subgroup analysis showed a significant interaction between treatment and region ( $P=0.045$ ), with less effect of ticagrelor in North America than in the rest of the world.

**Conclusions**—The regional interaction could arise from chance alone. Results of 2 independently performed analyses identified an underlying statistical interaction with aspirin maintenance dose as a possible explanation for the regional difference. The lowest risk of cardiovascular death, myocardial infarction, or stroke with ticagrelor compared with clopidogrel is associated with a low maintenance dose of concomitant aspirin.

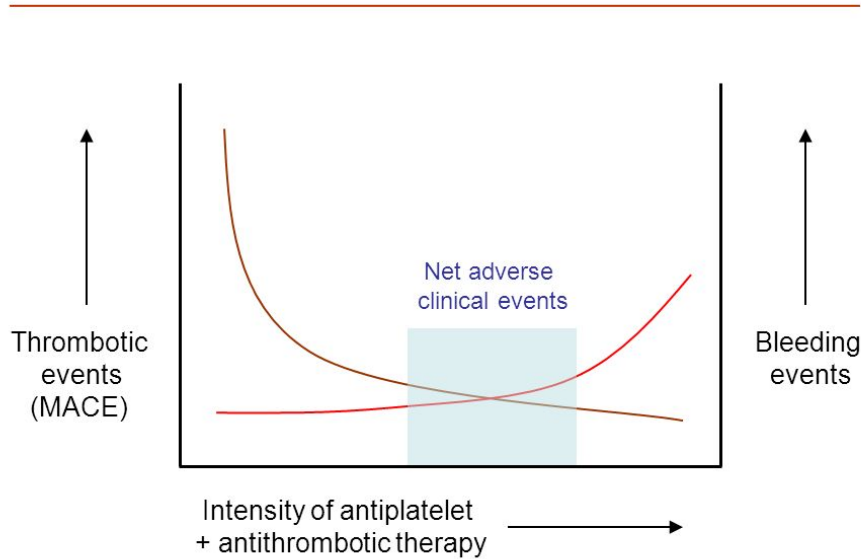
**Clinical Trial Registration**—URL: <http://www.clinicaltrials.gov>. Unique identifier: NCT00391872. (*Circulation*. 2011;124:544-554.)





# Balance between thrombotic versus bleeding risk

## Thrombosis/bleeding balance



Impact of bleeding on prognosis in patients using ticagrelor or prasugrel

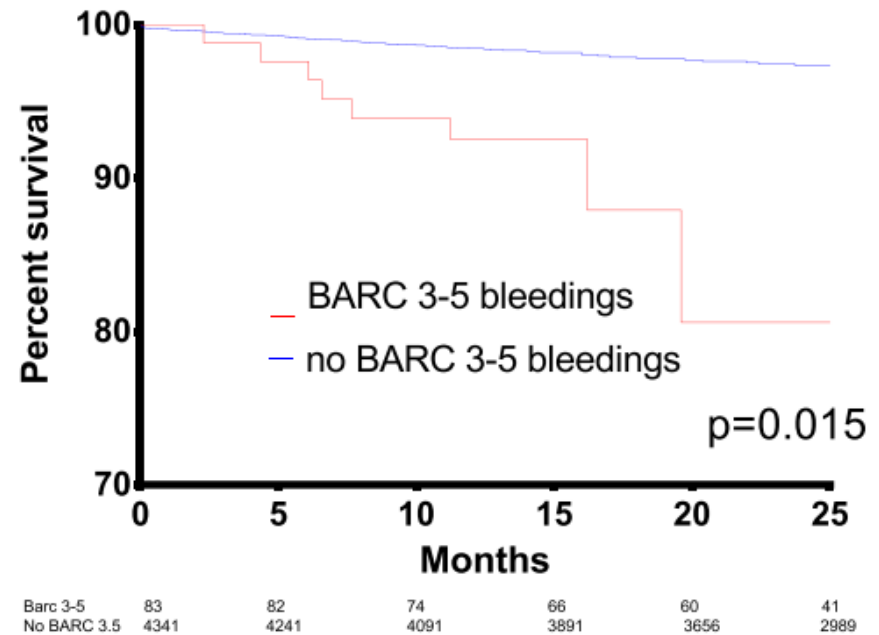


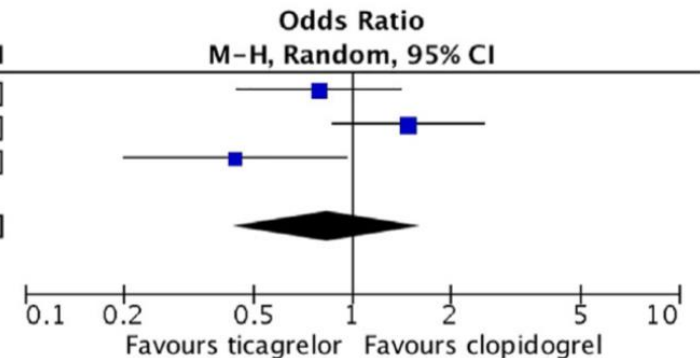
Fig. 2. Long term risk of death according to BARC 3-5 bleedings.



# Ticagrelor might not be better than Clopidogrel in East Asian population

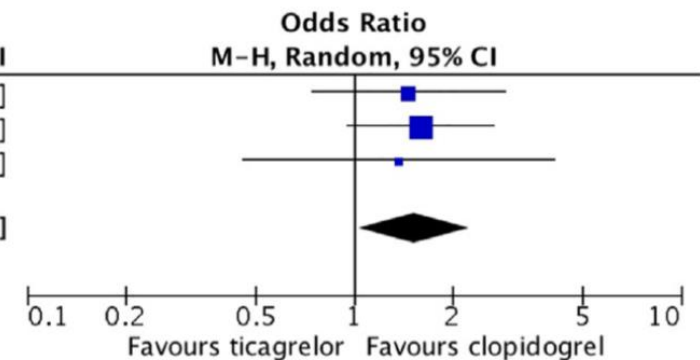
a) **Primary efficacy endpoint:** a composite of death from vascular causes, myocardial infarction, or stroke

Study or Subgroup	Ticagrelor		Clopidogrel		Weight	Odds Ratio M-H, Random, 95% CI
	Events	Total	Events	Total		
1. Kang HJ, et al.	23	278	28	273	34.9%	0.79 [0.44, 1.41]
2. Goto S, et al.	36	401	25	400	36.5%	1.48 [0.87, 2.51]
3. Wang H, et al.	11	100	22	100	28.5%	0.44 [0.20, 0.96]
<b>Total (95% CI)</b>		<b>779</b>		<b>773</b>	<b>100.0%</b>	<b>0.84 [0.43, 1.63]</b>
Total events	70		75			
Heterogeneity: $\text{Tau}^2 = 0.24$ ; $\text{Chi}^2 = 6.78$ , $\text{df} = 2$ ( $P = 0.03$ ); $I^2 = 71\%$						
Test for overall effect: $Z = 0.52$ ( $P = 0.60$ )						



b) **Primary safety endpoint:** major bleeding events

Study or Subgroup	Ticagrelor		Clopidogrel		Weight	Odds Ratio M-H, Random, 95% CI
	Events	Total	Events	Total		
1. Kang HJ, et al.	22	276	15	268	32.0%	1.46 [0.74, 2.88]
2. Goto S, et al.	40	401	26	400	55.7%	1.59 [0.95, 2.67]
3. Wang H, et al.	8	100	6	100	12.3%	1.36 [0.45, 4.08]
<b>Total (95% CI)</b>		<b>777</b>		<b>768</b>	<b>100.0%</b>	<b>1.52 [1.04, 2.23]</b>
Total events	70		47			
Heterogeneity: $\text{Tau}^2 = 0.00$ ; $\text{Chi}^2 = 0.08$ , $\text{df} = 2$ ( $P = 0.96$ ); $I^2 = 0\%$						
Test for overall effect: $Z = 2.14$ ( $P = 0.03$ )						



"Ticagrelor versus Clopidogrel in East Asian Patients with Acute Coronary Syndrome: Systematic Review and Meta-Analysis." *Cardiovascular Revascularization Medicine*



# Ticagrelor might not be better than Clopidogrel in East Asian population

Curr Cardiol Rep (2014) 16:485  
DOI 10.1007/s11886-014-0485-4

GLOBAL CARDIOVASCULAR HEALTH (SC SMITH, SECTION EDITOR)

## **“East Asian Paradox”: Challenge for the Current Antiplatelet Strategy of “One-Guideline-Fits-All Races” in Acute Coronary Syndrome**

**Young-Hoon Jeong**

- *Although there have been no conclusive large-scale clinical trials including East Asians only, recent pharmacodynamic and clinical studies have suggested more insight and confidence for the ‘East Asian Paradox’*



# Objectives

- Compare **net adverse clinical event (NACE)** between ticagrelor and clopidogrel in patients with Acute Coronary Syndrome through OHDSI network.



# Method: Study Population

- Inclusion Criteria
  - Adults ( $\geq 20$  yrs) who initiated ticagrelor or clopidogrel due to acute coronary syndrome (ACS) and undertook percutaneous coronary intervention (PCI)
- Exclusion Criteria
  - Prior history of stroke or gastrointestinal bleeding
  - Use of prasugrel or opposing drug within previous 30 days from index date



# Method: Outcome

## **Primary endpoint: Net Adverse Clinical Event (NACE)**

- Composite of recurrent myocardial infarction, any revascularization, ischemic stroke, intracranial hemorrhage, or gastrointestinal bleeding

## **Secondary endpoint**

- Ischemic Event
  - Recurrent myocardial infarction
  - Any revascularization (PCI + CABG)
  - Ischemic stroke
- Hemorrhagic Event (major bleeding)
  - Intracranial hemorrhage
  - Gastrointestinal bleeding
- Overall death
- Dyspnea (Positive control)



# Method: Statistical Analysis

- Primary risk window: within one year after the index year
- Secondary risk window
  - On-treatment
  - 5-year
  - With blanking period of 28 days
- Large scale propensity score matching
  - 96 Negative controls
  - PS stratification for sensitivity analysis
- Interaction term analysis
  - Gender, old age, Black or African race, MI, PPI use, high aspirin maintenance dose ( $\geq 300\text{mg}$ )



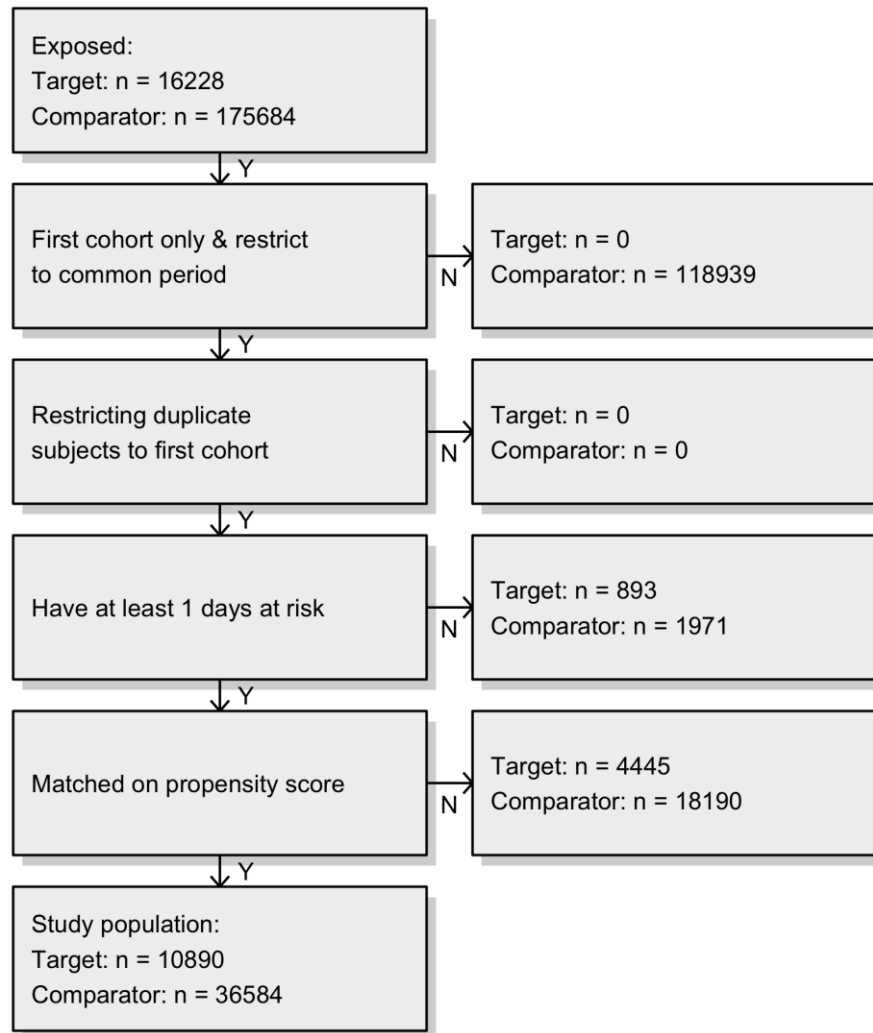
# Method

- Data source
  - **The whole national health records of patients undertook PCI from 2007 to 2016 were converted into OMOP-CDM in Korea (v1.1 completed)**
  - IQVIA's hospital data (v0.3 completed)



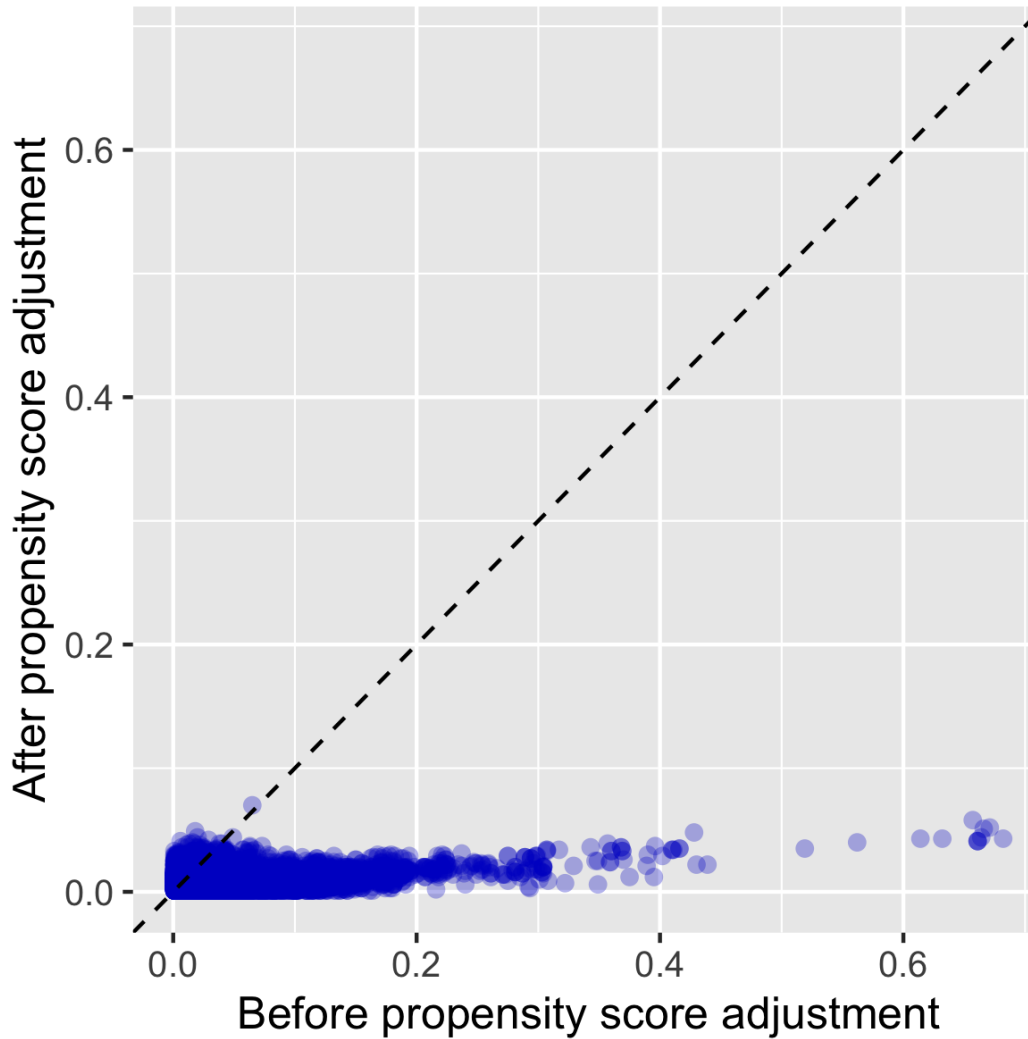


# Result: Patient flow chart



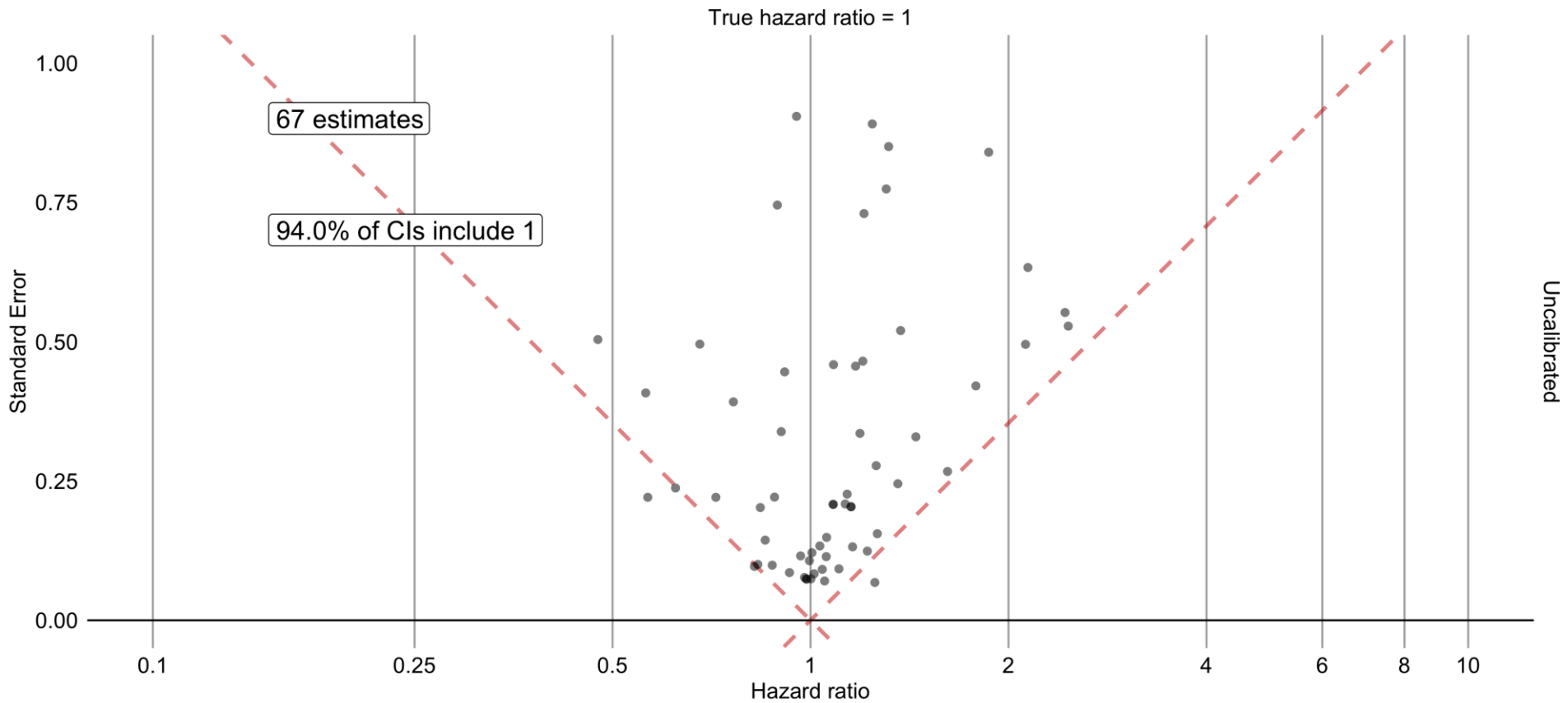


# Balance before and after PS matching



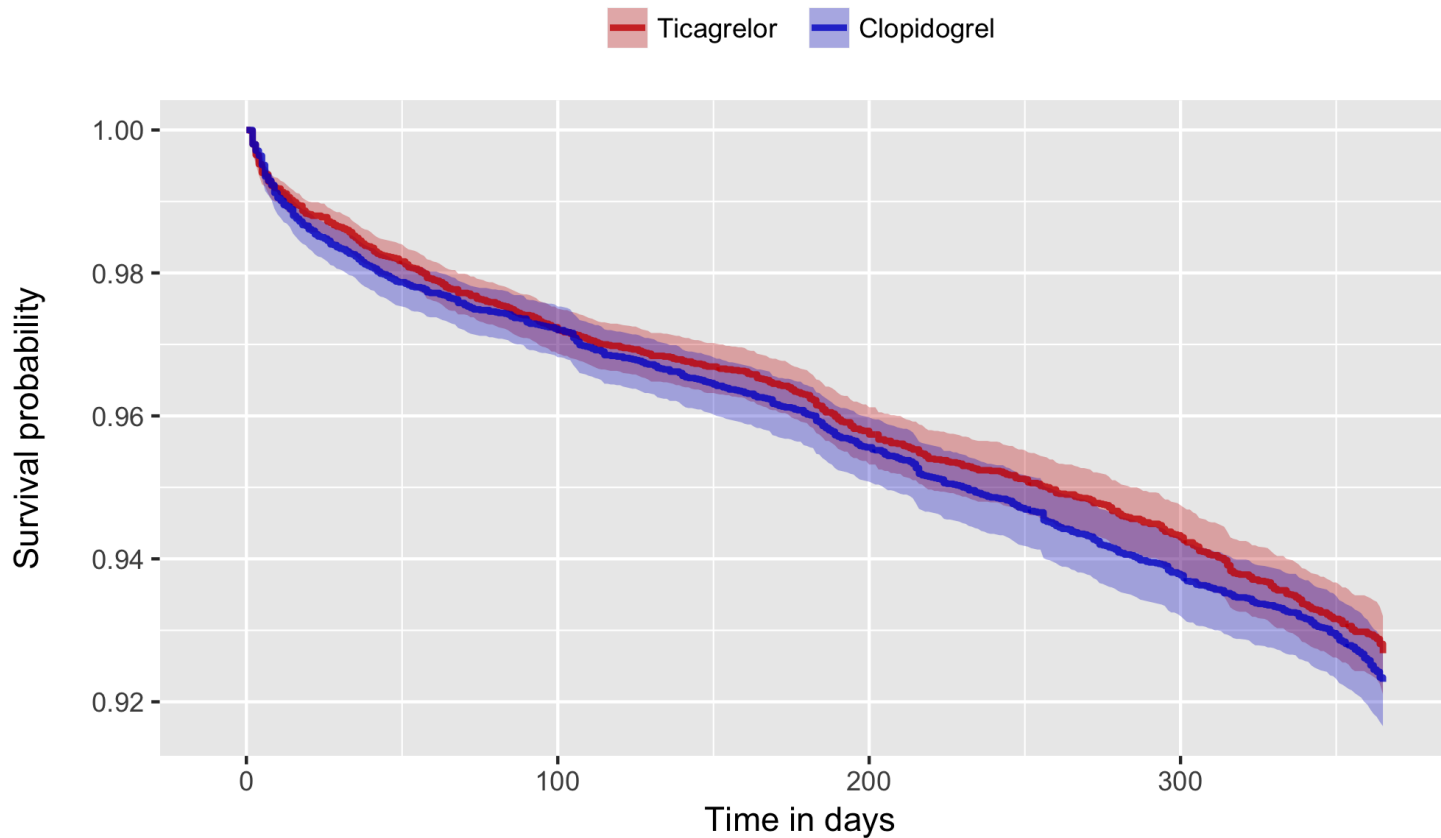


# Funnel plot for negative controls





# After matching: 1-year NACE

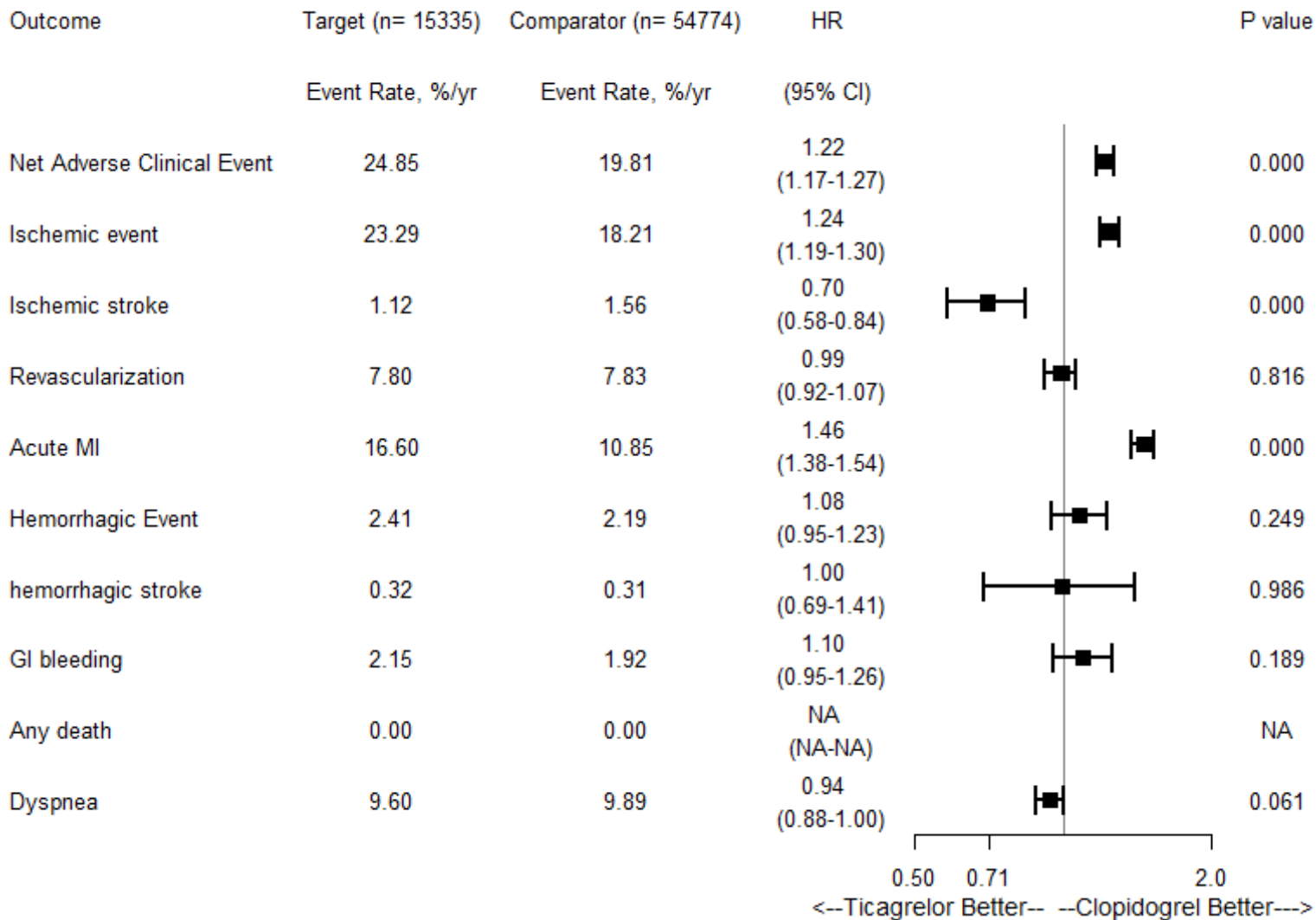


Number at risk				
Ticagrelor	10,890	9,418	8,289	7,085
Clopidogrel	36,584	32,098	28,740	25,345

HR 1.01;  $P=0.795$

# 1-year outcome without PS matching

## One-year outcome, without matching



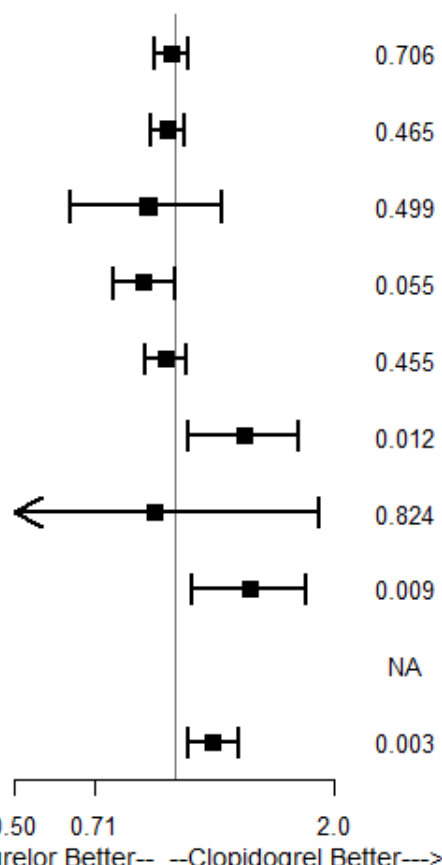




# Secondary analysis: On-treatment outcome after PS matching

## On-treatment, matching

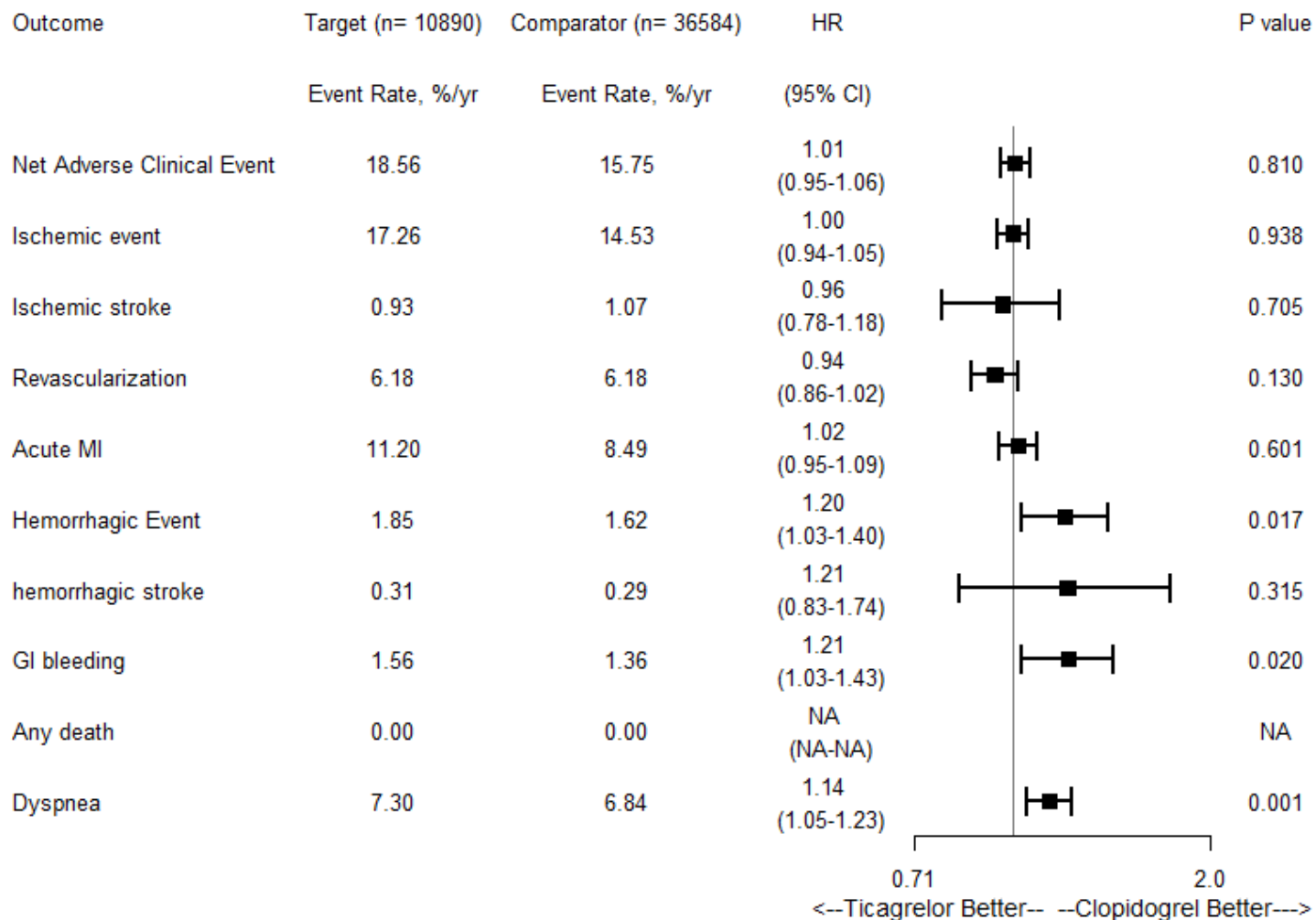
Outcome	Target (n= 10639)	Comparator (n= 35796)	HR	P value
	Event Rate, %/yr	Event Rate, %/yr	(95% CI)	
Net Adverse Clinical Event	27.26	20.23	0.99 (0.91-1.06)	0.706
Ischemic event	25.43	18.87	0.97 (0.90-1.05)	0.465
Ischemic stroke	1.10	1.15	0.89 (0.63-1.23)	0.499
Revascularization	8.00	7.31	0.88 (0.77-1.00)	0.055
Acute MI	18.33	12.13	0.97 (0.88-1.06)	0.455
Hemorrhagic Event	2.72	1.85	1.35 (1.06-1.71)	0.012
hemorrhagic stroke	0.28	0.26	0.92 (0.41-1.89)	0.824
GI bleeding	2.42	1.59	1.39 (1.08-1.78)	0.009
Any death	0.00	0.00	NA (NA-NA)	NA
Dyspnea	10.89	8.34	1.18 (1.06-1.32)	0.003



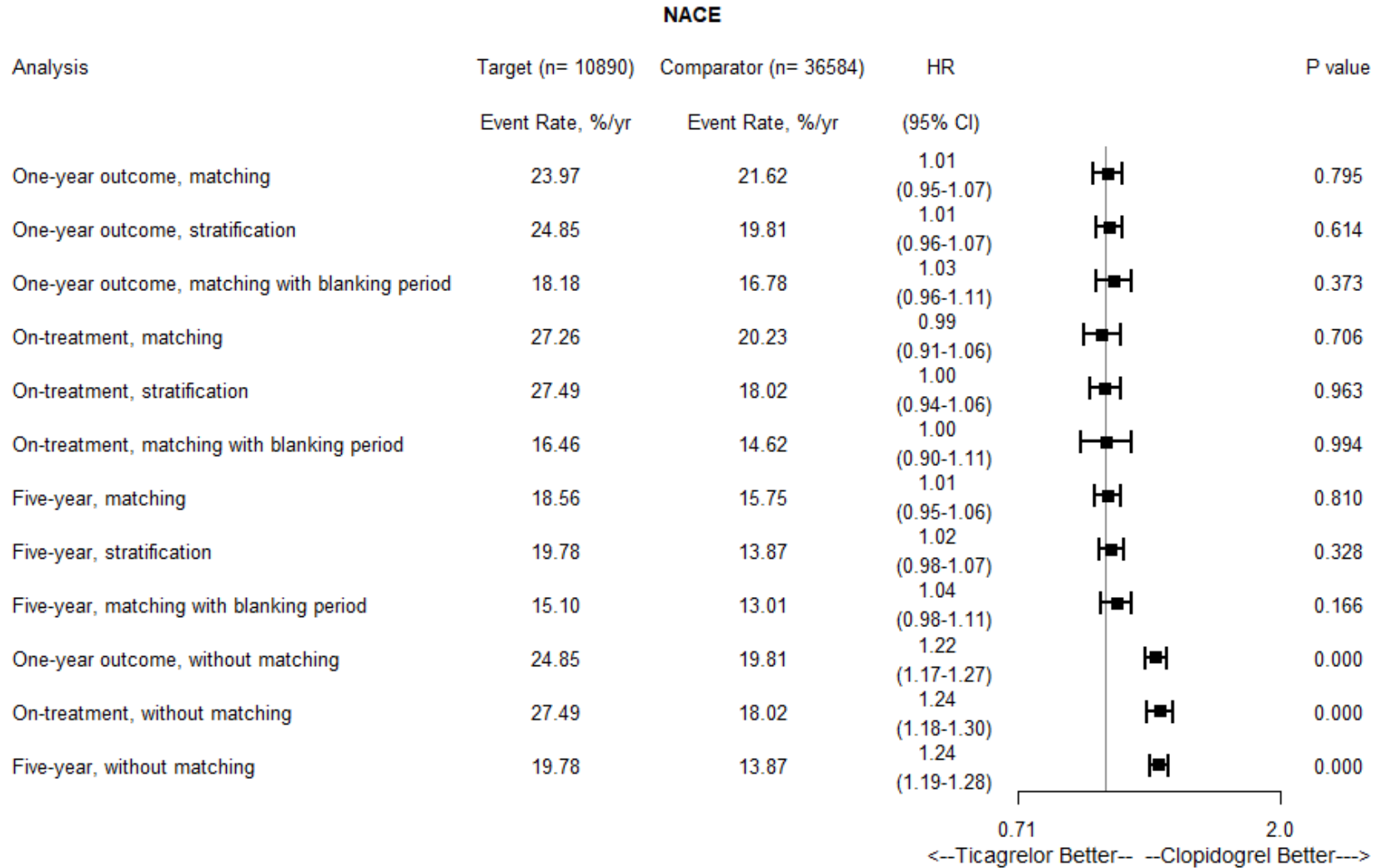


# Secondary analysis: 5-year outcome after PS matching

## Five-year, matching



# Outcome: Net-Adverse Adverse Event





# Outcome: ischemic outcome (ischemic stroke + MI + Revascularization)

## IschemicEvent

Analysis	Target (n= 10890)	Comparator (n= 36584)	HR	P value
	Event Rate, %/yr	Event Rate, %/yr	(95% CI)	
One-year outcome, matching	22.42	20.12	1.00 (0.94-1.07)	0.935
One-year outcome, stratification	23.29	18.21	1.00 (0.95-1.06)	0.977
One-year outcome, matching with blanking period	16.72	15.33	1.02 (0.95-1.10)	0.507
On-treatment, matching	25.43	18.87	0.97 (0.90-1.05)	0.465
On-treatment, stratification	25.85	16.60	0.98 (0.92-1.04)	0.503
On-treatment, matching with blanking period	14.94	13.30	0.98 (0.88-1.09)	0.753
Five-year, matching	17.26	14.53	1.00 (0.94-1.05)	0.938
Five-year, stratification	18.50	12.57	1.01 (0.96-1.06)	0.630
Five-year, matching with blanking period	13.84	11.86	1.04 (0.97-1.10)	0.258
One-year outcome, without matching	23.29	18.21	1.24 (1.19-1.30)	0.000
On-treatment, without matching	25.85	16.60	1.25 (1.19-1.32)	0.000
Five-year, without matching	18.50	12.57	1.27 (1.22-1.32)	0.000

0.71 2.0  
 <--Ticagrelor Better-- --Clopidogrel Better-->

# Outcome: Acute Myocardial Infarction

## AMI

Analysis	Target (n= 10890) Event Rate, %/yr	Comparator (n= 36584) Event Rate, %/yr	HR (95% CI)	P value
One-year outcome, matching	15.64	12.89	1.02 (0.95-1.10)	0.587
One-year outcome, stratification	16.60	10.85	1.00 (0.94-1.07)	0.996
One-year outcome, matching with blanking period	10.01	8.68	1.02 (0.93-1.12)	0.622
On-treatment, matching	18.33	12.13	0.97 (0.88-1.06)	0.455
On-treatment, stratification	19.14	9.84	0.97 (0.90-1.05)	0.497
On-treatment, matching with blanking period	8.62	7.24	0.92 (0.80-1.05)	0.216
Five-year, matching	11.20	8.49	1.02 (0.95-1.09)	0.601
Five-year, stratification	12.36	6.65	1.01 (0.95-1.07)	0.813
Five-year, matching with blanking period	8.02	6.31	1.03 (0.95-1.11)	0.497
One-year outcome, without matching	16.60	10.85	1.46 (1.38-1.54)	0.000
On-treatment, without matching	19.14	9.84	1.43 (1.34-1.52)	0.000
Five-year, without matching	12.36	6.65	1.52 (1.45-1.60)	0.000

0.71                                      2.0  
 <--Ticagrelor Better--    --Clopidogrel Better-->



# Outcome: ischemic stroke

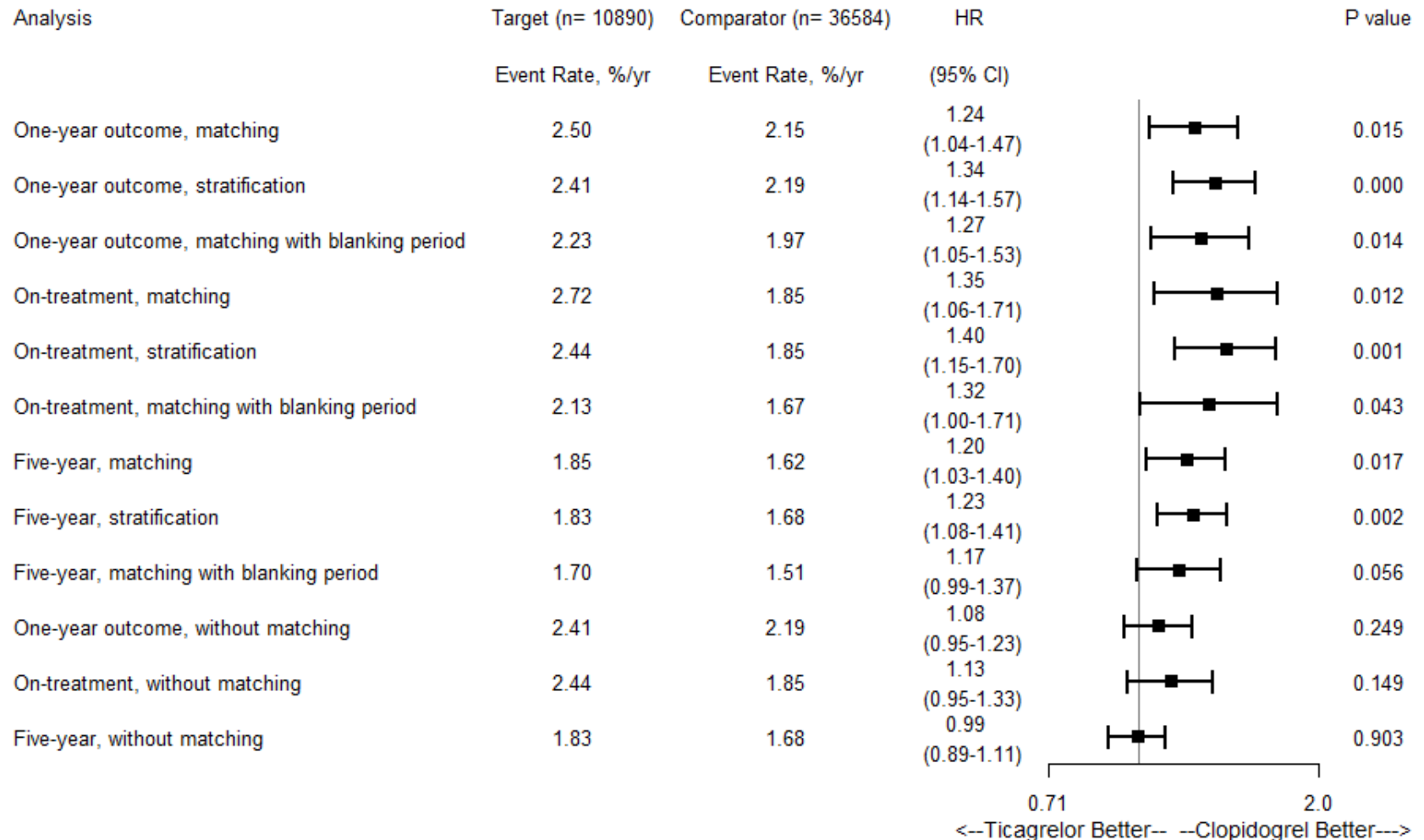
## IschemicEvent

Analysis	Target (n= 10890)	Comparator (n= 36584)	HR	P value
	Event Rate, %/yr	Event Rate, %/yr	(95% CI)	
One-year outcome, matching	22.42	20.12	1.00 (0.94-1.07)	0.935
One-year outcome, stratification	23.29	18.21	1.00 (0.95-1.06)	0.977
One-year outcome, matching with blanking period	16.72	15.33	1.02 (0.95-1.10)	0.507
On-treatment, matching	25.43	18.87	0.97 (0.90-1.05)	0.465
On-treatment, stratification	25.85	16.60	0.98 (0.92-1.04)	0.503
On-treatment, matching with blanking period	14.94	13.30	0.98 (0.88-1.09)	0.753
Five-year, matching	17.26	14.53	1.00 (0.94-1.05)	0.938
Five-year, stratification	18.50	12.57	1.01 (0.96-1.06)	0.630
Five-year, matching with blanking period	13.84	11.86	1.04 (0.97-1.10)	0.258
One-year outcome, without matching	23.29	18.21	1.24 (1.19-1.30)	0.000
On-treatment, without matching	25.85	16.60	1.25 (1.19-1.32)	0.000
Five-year, without matching	18.50	12.57	1.27 (1.22-1.32)	0.000

0.71 2.0  
 <--Ticagrelor Better-- --Clopidogrel Better-->

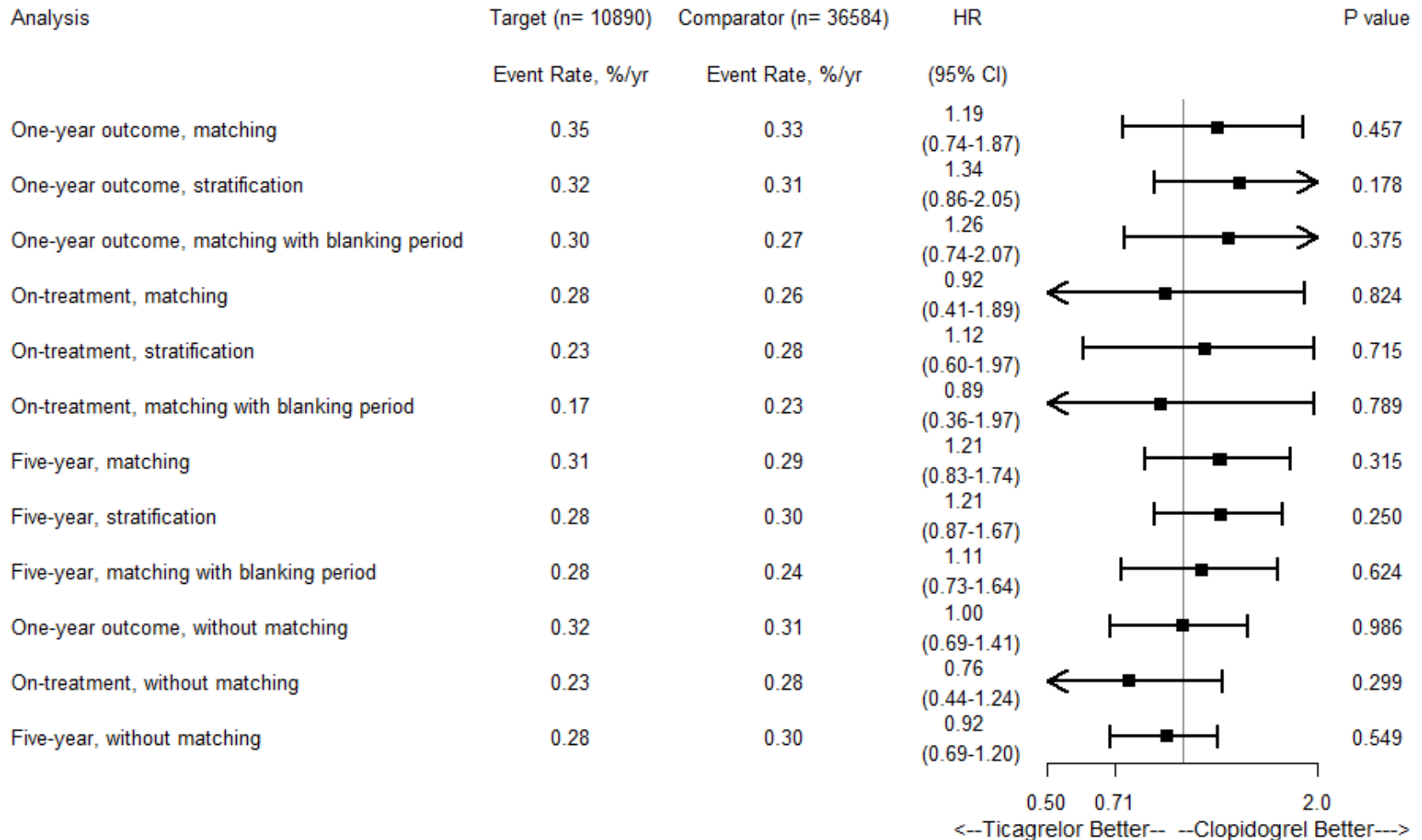
# Outcome: hemorrhagic outcome (hemorrhagic stroke + GI bleeding)

## HemorrhagicEvent



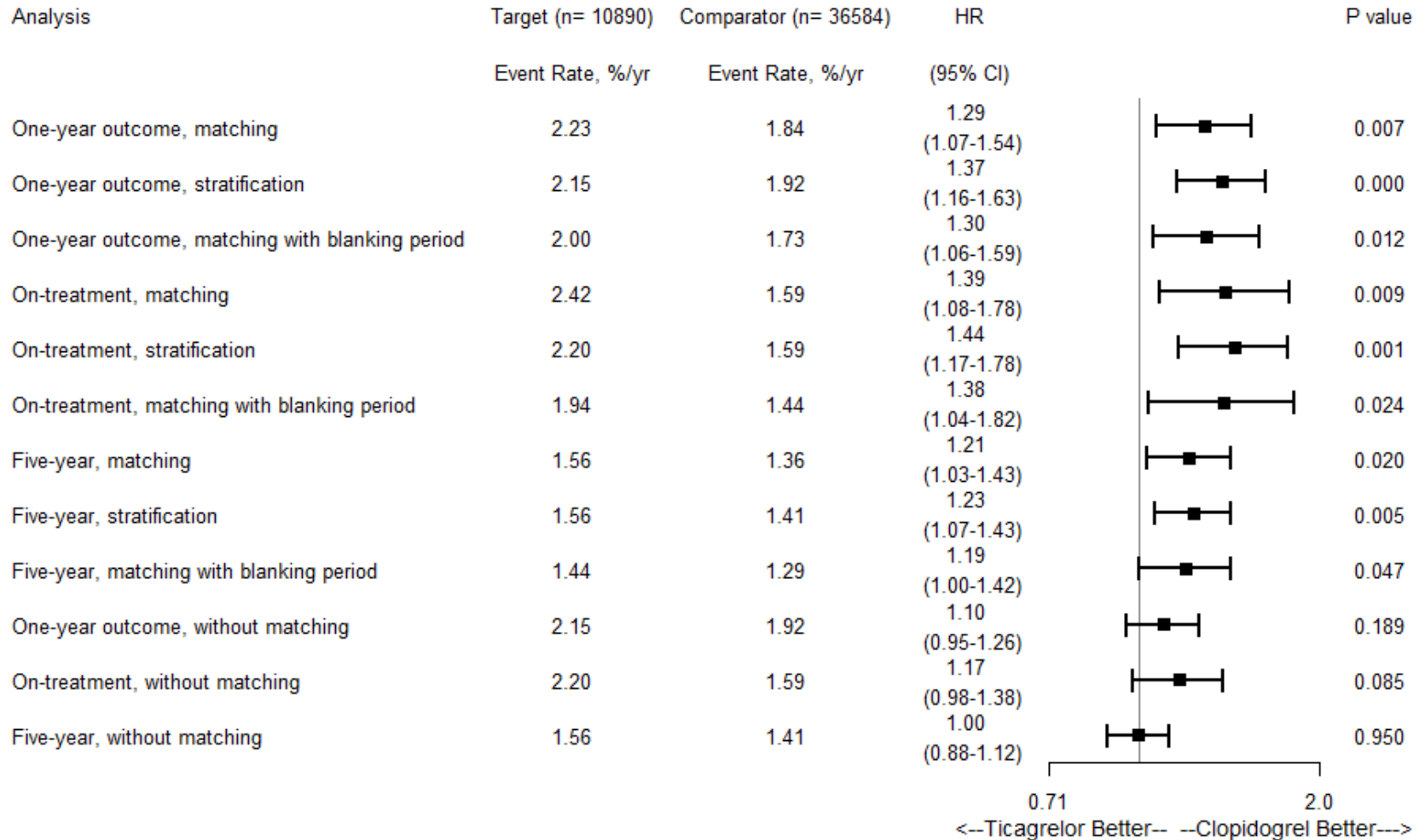
# Outcome: Hemorrhagic stroke

## hemorrhagicStroke



# Outcome: GI bleeding

## giBleeding







# Outcome: Dyspnea

## dyspnea

Analysis	Target (n= 10890)	Comparator (n= 36584)	HR	P value
	Event Rate, %/yr	Event Rate, %/yr	(95% CI)	
One-year outcome, matching	9.76	9.32	1.15 (1.05-1.25)	0.002
One-year outcome, stratification	9.60	9.89	1.13 (1.04-1.23)	0.004
One-year outcome, matching with blanking period	8.20	8.10	1.15 (1.04-1.27)	0.006
On-treatment, matching	10.89	8.34	1.18 (1.06-1.32)	0.003
On-treatment, stratification	10.37	8.57	1.14 (1.03-1.25)	0.011
On-treatment, matching with blanking period	7.44	6.50	1.12 (0.97-1.29)	0.108
Five-year, matching	7.30	6.84	1.14 (1.05-1.23)	0.001
Five-year, stratification	7.29	7.11	1.11 (1.04-1.19)	0.003
Five-year, matching with blanking period	6.40	6.18	1.13 (1.04-1.23)	0.005
One-year outcome, without matching	9.60	9.89	0.94 (0.88-1.00)	0.061
On-treatment, without matching	10.37	8.57	0.95 (0.87-1.02)	0.176
Five-year, without matching	7.29	7.11	0.92 (0.87-0.97)	0.003

0.71 2.0  
 <--Ticagrelor Better-- --Clopidogrel Better-->



# Interaction term analysis (NACE)

	HR	p	HRR	p
Female	0.98	0.12	1.27	<0.01
Elderly (65years)	0.95	0.21	1.15	0.04
Acute MI	1.02	0.52	0.85	0.39
Concomitant PPI use	1	0.91	0.91	0.72
High maintenance aspirin dosage	1.01	0.65	1.04	0.72

- Female and old patients might be more susceptible to the ticagrelor than male or younger patients.



# Summary

- The risk of NACE was comparable between Ticagrelor and Clopidogrel during one-year after ACS in Korean population
- Ticagrelor use was not associated with lower risk of ischemic event
- Ticagrelor use was related with higher risk of hemorrhagic event, especially GI bleeding
- The results for primary and secondary outcome were mostly consistent after PS matching or stratification



# Evidence Explorer

- Result from IQVIA was published through R Shiny (Evidence Explorer)
- <https://chandryou.shinyapps.io/TicagrelorVsClopidogrel/>



# Study Protocol History

- V0.1 (2018.12.11) : Initial draft
- V0.2 (2019.2.16)
  - Revision of outcome definition
  - More covariates were added for estimation of propensity scores
- V0.3 (2019.3.3)
  - Statistical method of primary analysis was changed from 1-to-1 matching to variable ratio matching to avoid inferior covariate balance and bias reduction.
  - Sensitivity analyses, which includes only those who start the clopidogrel or ticagrelor from 2013 to 2017, and outcome with narrow definition were added.
- V1.0 (2019.5.9)
  - Revision of index event for the study population from drug initiation to PCI due to ACS
  - Positive control section was removed. Some negative controls, which have potential relationship with cardiovascular diseases or antiplatelet drug were removed.
  - Adding sensitivity analysis with 28-day blanking period to exclude duplicated coding for the outcomes
- V1.1 (2019.5.24)
  - Revision of target and comparator cohort:
    - Because there are databases do not have visit ID link between drug exposure and procedure, the primary inclusion criteria were revised to use time-based rule rather than same visit based rule.
    - Because many US patients take aspirin over-the-counter, the constraint for the concomitant use of aspirin in target and comparator cohort was removed.



# The lessons from this study

- Validation of phenotypes
- Usage of Git as the core of the OHDSI PLE study
  - Version control
  - Issue control
    - Bugs
    - Enhancement
- Recruiting study partners and listening their comments



# Validation of phenotypes

- We cannot just believe in the accuracy of the phenotypes defined in ATLAS
- I reviewed the discharge note manually to evaluate the accuracy of the outcome definition

name	total_population_count	validated_population	positive	negative	inconclusive	PPV
broad ischemic stroke	233774					
ischemic stroke inpatient or ED	15268					
ischemic stroke primary condition	193236					
ischemic stroke (inpatient or ED) and primary condition	12986	214	92	42	80	0.686567
ischemic stroke (inpatient or ED) and primary condition and first event	10235	213	113	27	73	0.807143

<https://github.com/OHDSI/PhenotypeLibrary/blob/master/ischemic%20stroke/extra/metadata.csv>



# Further development

- Should we impute death?

Drug Safety  
<https://doi.org/10.1007/s40264-019-00827-0>

ORIGINAL RESEARCH ARTICLE



## Identifying the DEAD: Development and Validation of a Patient-Level Model to Predict Death Status in Population-Level Claims Data

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**Abstract**

**Introduction** US claims data contain medical data on large heterogeneous populations and are excellent sources for medical research. Some claims data do not contain complete death records, limiting their use for mortality or mortality-related studies. A model to predict whether a patient died at the end of the follow-up time (referred to as the end of observation) is needed to enable mortality-related studies.

**Objective** The objective of this study was to develop a patient-level model to predict whether the end of observation was due to death in US claims data.

**Methods** We used a claims dataset with full death records, Optum<sup>®</sup> De-Identified Clinformatics<sup>®</sup> Data-Mart-Database—Date of Death mapped to the Observational Medical Outcome Partnership common data model, to develop a model that classifies the end of observations into death or non-death. A regularized logistic regression was trained using 88,514 predictors (recorded within the prior 365 or 30 days) and externally validated by applying the model to three US claims datasets.

**Results** Approximately 25 in 1000 end of observations in Optum are due to death. The Discriminating End of observation into Alive and Dead (DEAD) model obtained an area under the receiver operating characteristic curve of 0.986. When defining death as a predicted risk of > 0.5, only 2% of the end of observations were predicted to be due to death and the model obtained a sensitivity of 62% and a positive predictive value of 74.8%. The external validation showed the model was transportable, with area under the receiver operating characteristic curves ranging between 0.951 and 0.995 across the US claims databases.

**Conclusions** US claims data often lack complete death records. The DEAD model can be used to impute death at various sensitivity, specificity, or positive predictive values depending on the use of the model. The DEAD model can be readily applied to any observational healthcare database mapped to the Observational Medical Outcome Partnership common data model and is available from <https://github.com/OHDSI/StudyProtocolSandbox/tree/master/DeadModel>.



*Thank  
You*  
for your time