

# **Prevalence and Prognostic Associations of Cardiac Abnormalities Among Hospitalized Patients with COVID-19 – A Systematic Review and Meta-Analysis**

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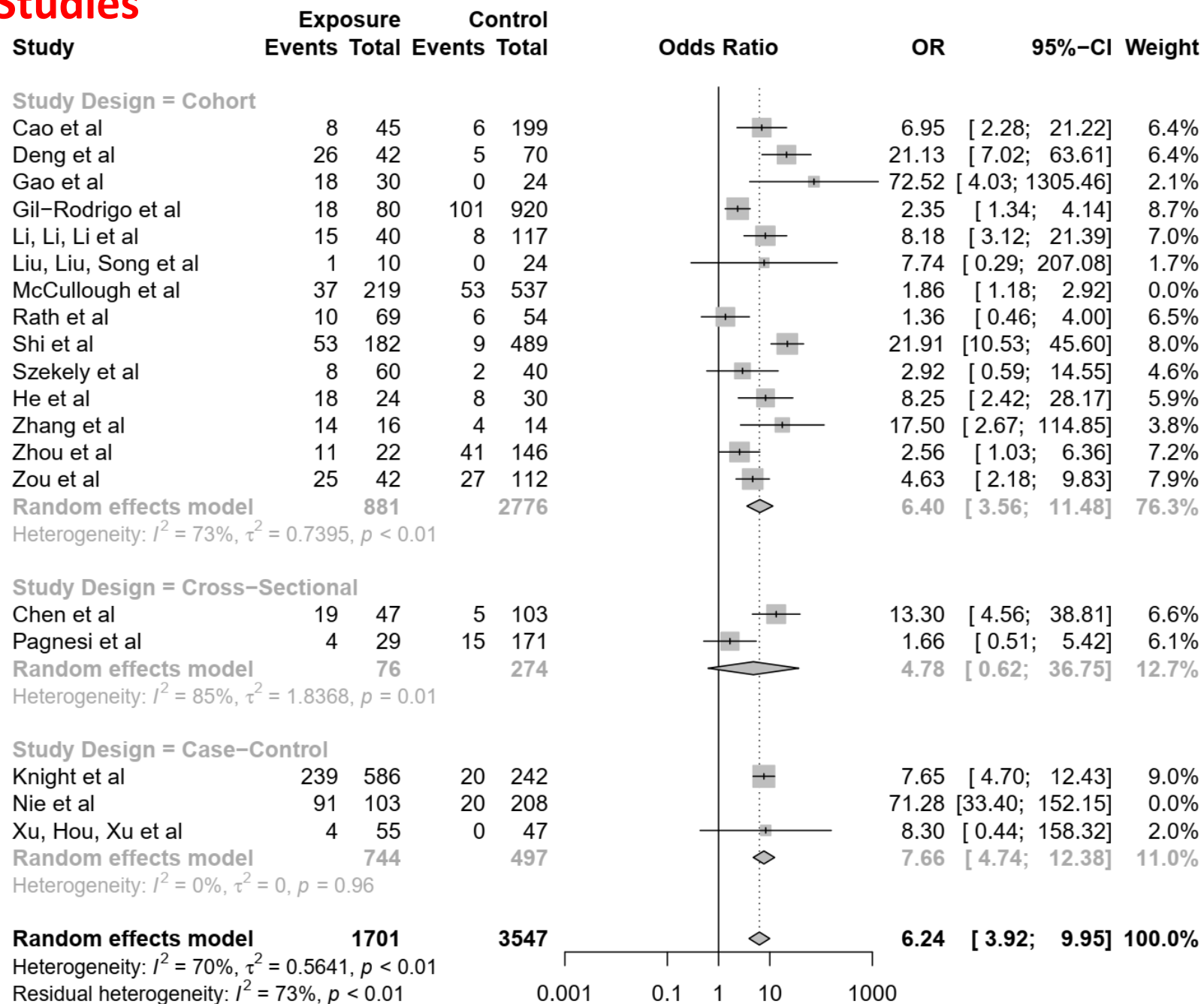
# Sensitivity Analysis

# Analyses Performed: Briefer

- Outlier Remover
  - An automatic function that removes outliers
- Leave-One-Out Analysis
  - Remove one study and see its effect on heterogeneity
- Influence Diagnostics
  - Several metrics

Pooled OR

# Pooled OR of All Studies



Identified outliers (random-effects model)

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"McCullough et al", "Nie et al"

Results with outliers removed

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	OR	95%-CI	%W (random)	Study Design	exclude
Cao et al	6.9550	[ 2.2797; 21.2184]	6.4	Cohort	
Deng et al	21.1250	[ 7.0152; 63.6139]	6.4	Cohort	
Gao et al	72.5200	[ 4.0286; 1305.4562]	2.1	Cohort	
Gil-Rodrigo et al	2.3542	[ 1.3394; 4.1380]	8.7	Cohort	
Li, Li, Li et al	8.1750	[ 3.1243; 21.3904]	7.0	Cohort	
Liu, Liu, Song et al	7.7368	[ 0.2891; 207.0783]	1.7	Cohort	
McCullough et al	1.8565	[ 1.1800; 2.9208]	0.0	Cohort	*
Rath et al	1.3559	[ 0.4598; 3.9986]	6.5	Cohort	
Shi et al	21.9121	[10.5295; 45.5999]	8.0	Cohort	
Szekely et al	2.9231	[ 0.5872; 14.5500]	4.6	Cohort	
He et al	8.2500	[ 2.4158; 28.1741]	5.9	Cohort	
Zhang et al	17.5000	[ 2.6666; 114.8459]	3.8	Cohort	
Zhou et al	2.5610	[ 1.0305; 6.3645]	7.2	Cohort	
Zou et al	4.6296	[ 2.1802; 9.8309]	7.9	Cohort	
Chen et al	13.3000	[ 4.5578; 38.8102]	6.6	Cross-Sectional	
Pagnesi et al	1.6640	[ 0.5108; 5.4207]	6.1	Cross-Sectional	
Knight et al	7.6452	[ 4.7009; 12.4338]	9.0	Case-Control	
Nie et al	71.2833	[33.3974; 152.1468]	0.0	Case-Control	*
Xu, Hou, Xu et al	8.3010	[ 0.4352; 158.3169]	2.0	Case-Control	

Number of studies combined: k = 17

	OR	95%-CI	z	p-value
Random effects model	6.2434	[3.9177; 9.9498]	7.70	< 0.0001

Quantifying heterogeneity:

$\tau^2 = 0.5641$ ;  $\tau = 0.7511$ ;  $I^2 = 69.5\%$  [49.9%; 81.5%];  $H = 1.81$  [1.41; 2.32]

Quantifying residual heterogeneity:

$I^2 = 72.5\%$  [54.0%; 83.6%];  $H = 1.91$  [1.47; 2.47]

Test of heterogeneity:

Q	d.f.	p-value
52.54	16	< 0.0001

Results for subgroups (random effects model):

	k	OR	95%-CI	$\tau^2$	$\tau$	Q	$I^2$
Study Design = Cohort	13	6.3957	[3.5619; 11.4841]	0.7395	0.8599	44.43	73.0%
Study Design = Cross-Sectional	2	4.7777	[0.6211; 36.7506]	1.8368	1.3553	6.55	84.7%
Study Design = Case-Control	2	7.6619	[4.7418; 12.3804]	0	0	0.00	0.0%

Test for subgroup differences (random effects model):

	Q	d.f.	p-value
Between groups	0.36	2	0.8346

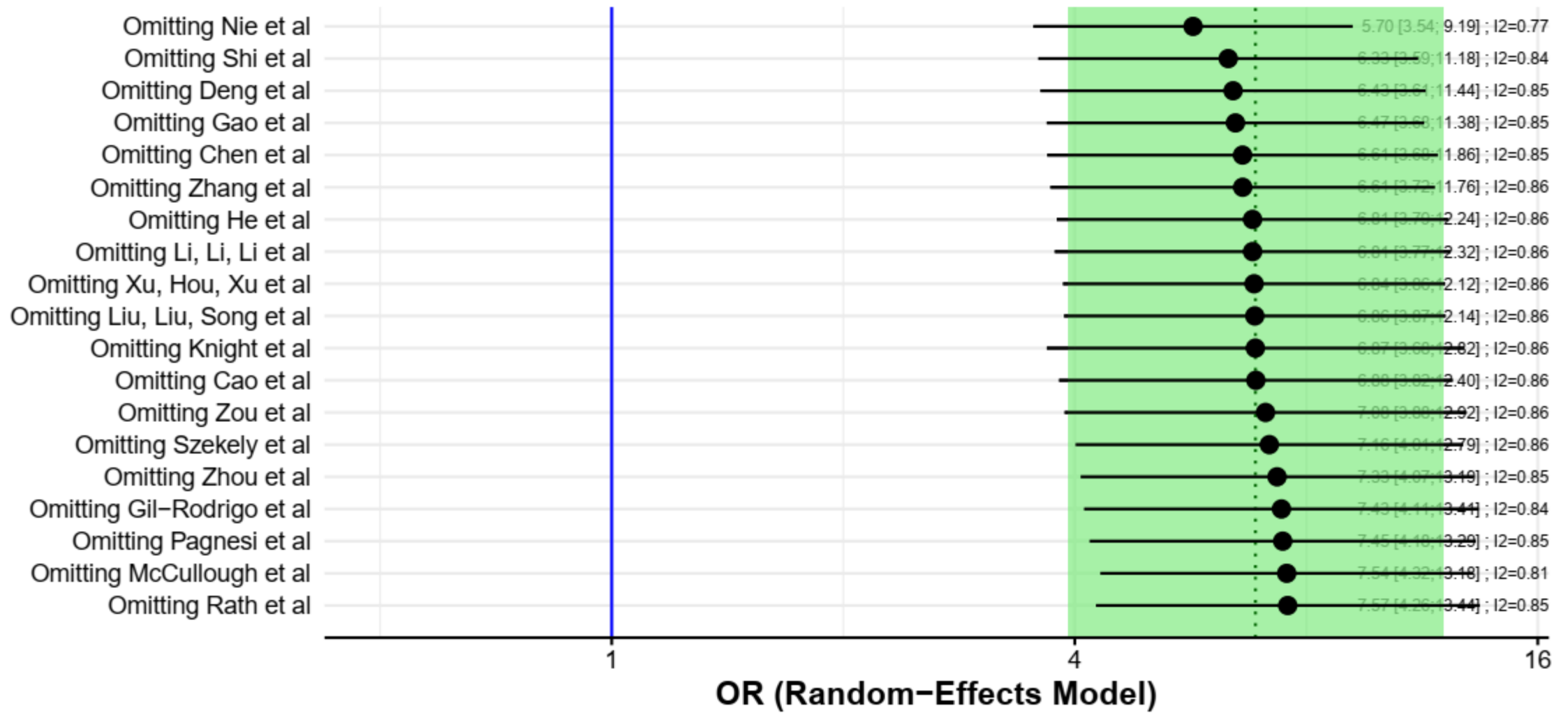
Details on meta-analytical method:

- Mantel-Haenszel method
- DerSimonian-Laird estimator for  $\tau^2$
- Mantel-Haenszel estimator used in calculation of Q and  $\tau^2$  (like RevMan 5)
- Continuity correction of 0.5 in studies with zero cell frequencies

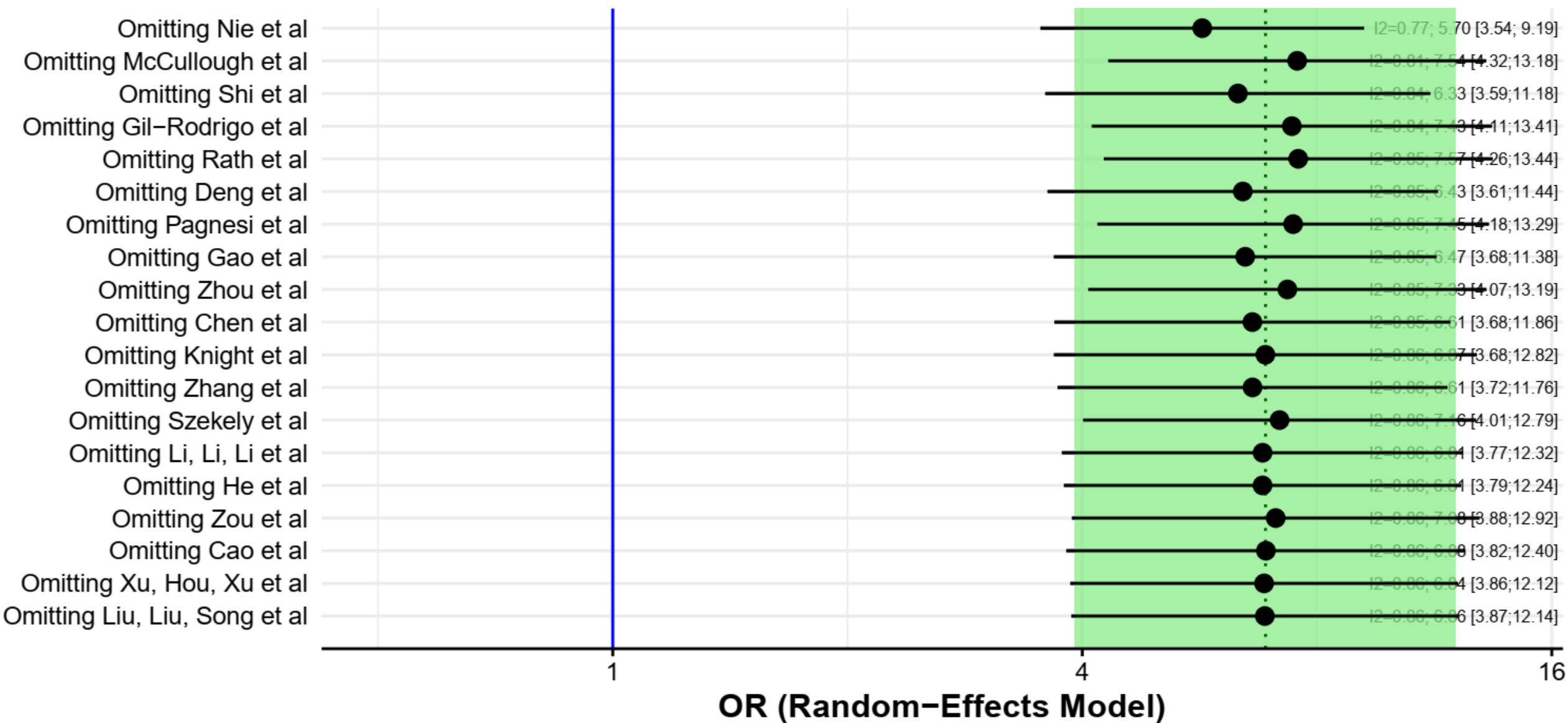
# Influence Analysis of Pooled OR



### Sorted by Effect Size



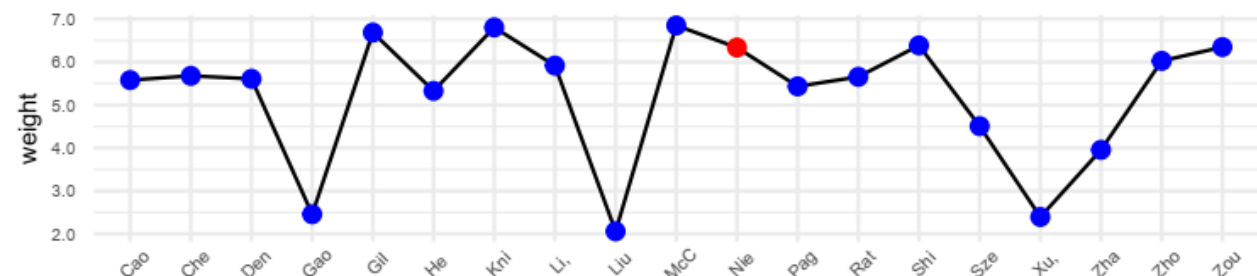
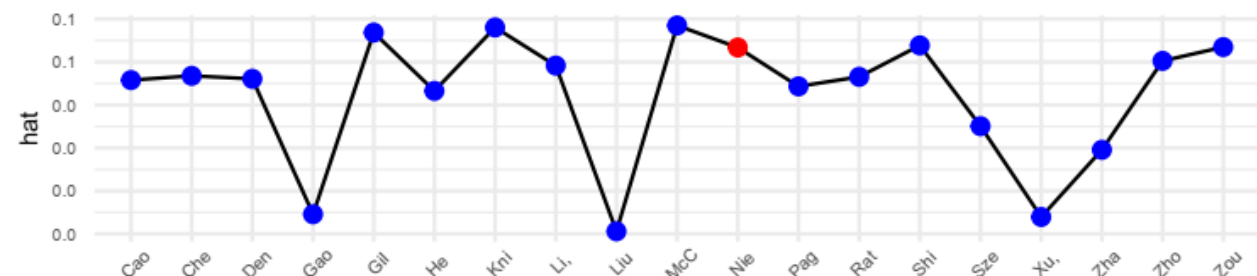
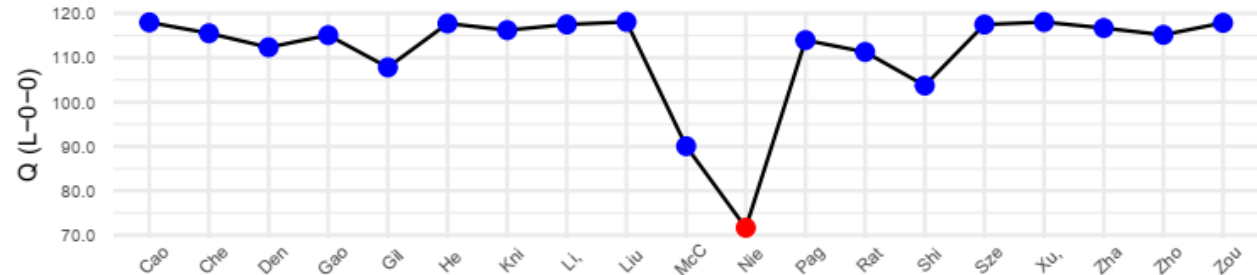
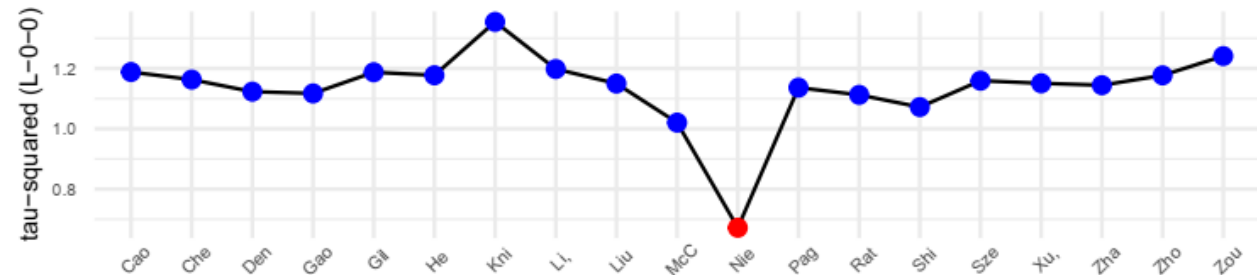
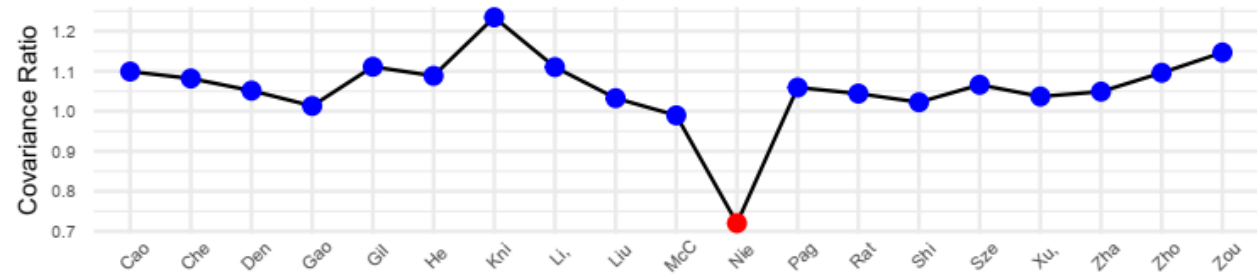
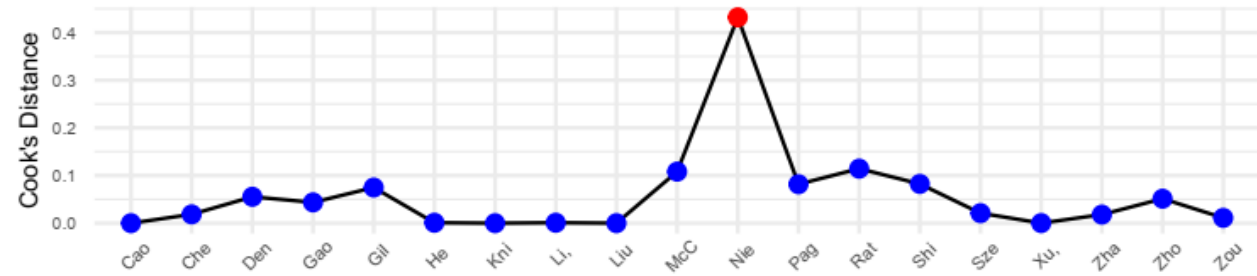
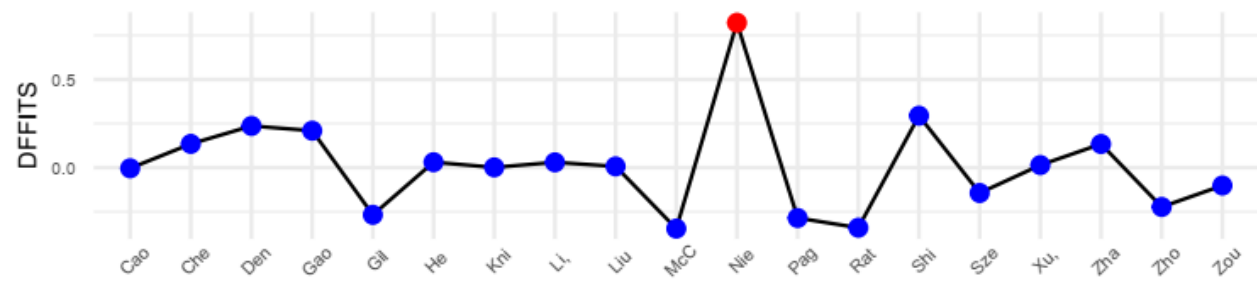
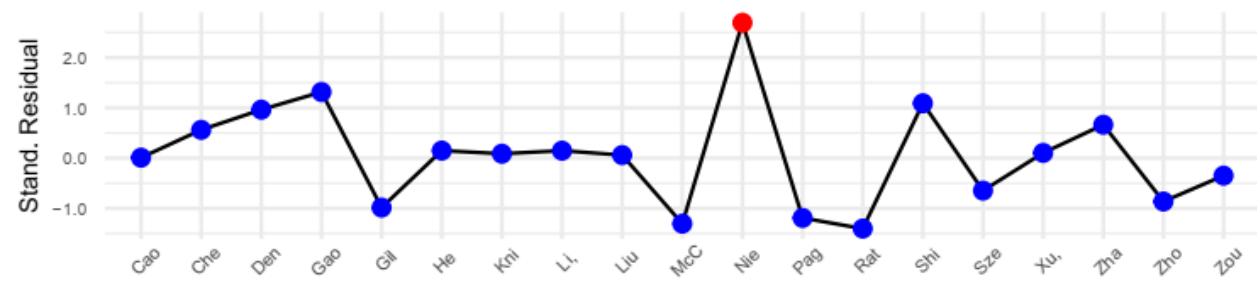
## Sorted by I-squared



## Leave-One-Out Analysis (Sorted by I2)

	Effect	LLCI	ULCI	I2
Omitting Nie et al	5.700	3.535	9.191	0.766
Omitting McCullough et al	7.545	4.319	13.180	0.813
Omitting Shi et al	6.333	3.587	11.181	0.838
Omitting Gil-Rodrigo et al	7.427	4.114	13.408	0.843
Omitting Rath et al	7.567	4.262	13.436	0.849
Omitting Deng et al	6.426	3.611	11.435	0.851
Omitting Pagnesi et al	7.455	4.183	13.288	0.852
Omitting Gao et al	6.471	3.679	11.385	0.854
Omitting Zhou et al	7.329	4.072	13.194	0.854
Omitting Chen et al	6.610	3.684	11.861	0.855
Omitting Knight et al	6.869	3.679	12.824	0.855
Omitting Zhang et al	6.613	3.719	11.757	0.856
Omitting Li, Li, Li et al	6.812	3.768	12.316	0.857
Omitting Szekely et al	7.162	4.010	12.793	0.857
Omitting He et al	6.811	3.790	12.241	0.857
Omitting Zou et al	7.081	3.880	12.922	0.857
Omitting Cao et al	6.879	3.817	12.399	0.858
Omitting Liu, Liu, Song et al	6.857	3.875	12.137	0.858
Omitting Xu, Hou, Xu et al	6.843	3.862	12.124	0.858

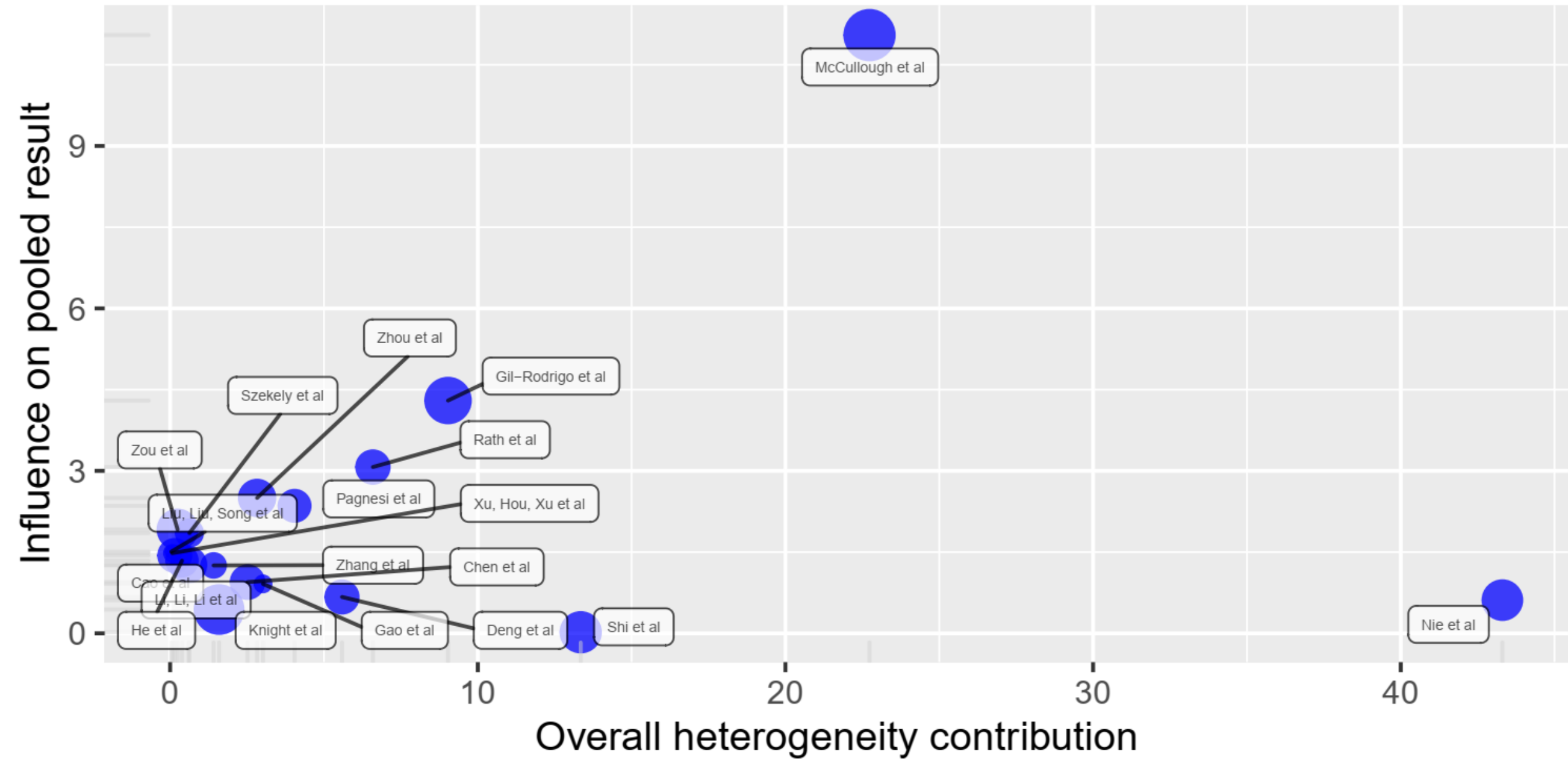
# Note how Nie et al (red dot) is an outlier. (Influence Plot)



# Influence Diagnostics

	rstudent	dffits	cook.d	cov.r	QE.del	hat	weight	infl
Omitting Cao et al	0.009	-0.004	0.000	1.099	117.958	0.056	5.579	
Omitting Deng et al	0.964	0.236	0.055	1.051	112.339	0.056	5.608	
Omitting Gao et al	1.316	0.209	0.044	1.013	115.076	0.025	2.458	
Omitting Gil-Rodrigo et al	-0.985	-0.268	0.075	1.111	107.814	0.067	6.684	
Omitting Li, Li, Li et al	0.148	0.030	0.001	1.110	117.485	0.059	5.916	
Omitting Liu, Liu, Song et al	0.060	0.007	0.000	1.033	118.073	0.021	2.061	
Omitting McCullough et al	-1.305	-0.346	0.108	0.990	90.044	0.068	6.849	
Omitting Rath et al	-1.403	-0.341	0.114	1.044	111.292	0.057	5.654	
Omitting Shi et al	1.091	0.294	0.082	1.022	103.720	0.064	6.385	
Omitting Szekely et al	-0.647	-0.144	0.021	1.066	117.474	0.045	4.507	
Omitting He et al	0.149	0.031	0.001	1.088	117.715	0.053	5.327	
Omitting Zhang et al	0.664	0.134	0.018	1.049	116.682	0.040	3.957	
Omitting Zhou et al	-0.863	-0.223	0.051	1.096	115.146	0.060	6.026	
Omitting Zou et al	-0.349	-0.101	0.011	1.147	117.852	0.063	6.346	
Omitting Chen et al	0.562	0.135	0.018	1.082	115.506	0.057	5.677	
Omitting Pagnesi et al	-1.191	-0.286	0.082	1.059	113.949	0.054	5.433	
Omitting Knight et al	0.087	0.001	0.000	1.235	116.205	0.068	6.803	
Omitting Nie et al	2.694	0.822	0.432	0.720	71.653	0.063	6.336	*
Omitting Xu, Hou, Xu et al	0.104	0.014	0.000	1.037	118.041	0.024	2.394	

Note how Nie et al and McCullough et al are outliers. (Baujat Plot)



# Baujat Diagnostics (sorted by Heterogeneity Contribution)

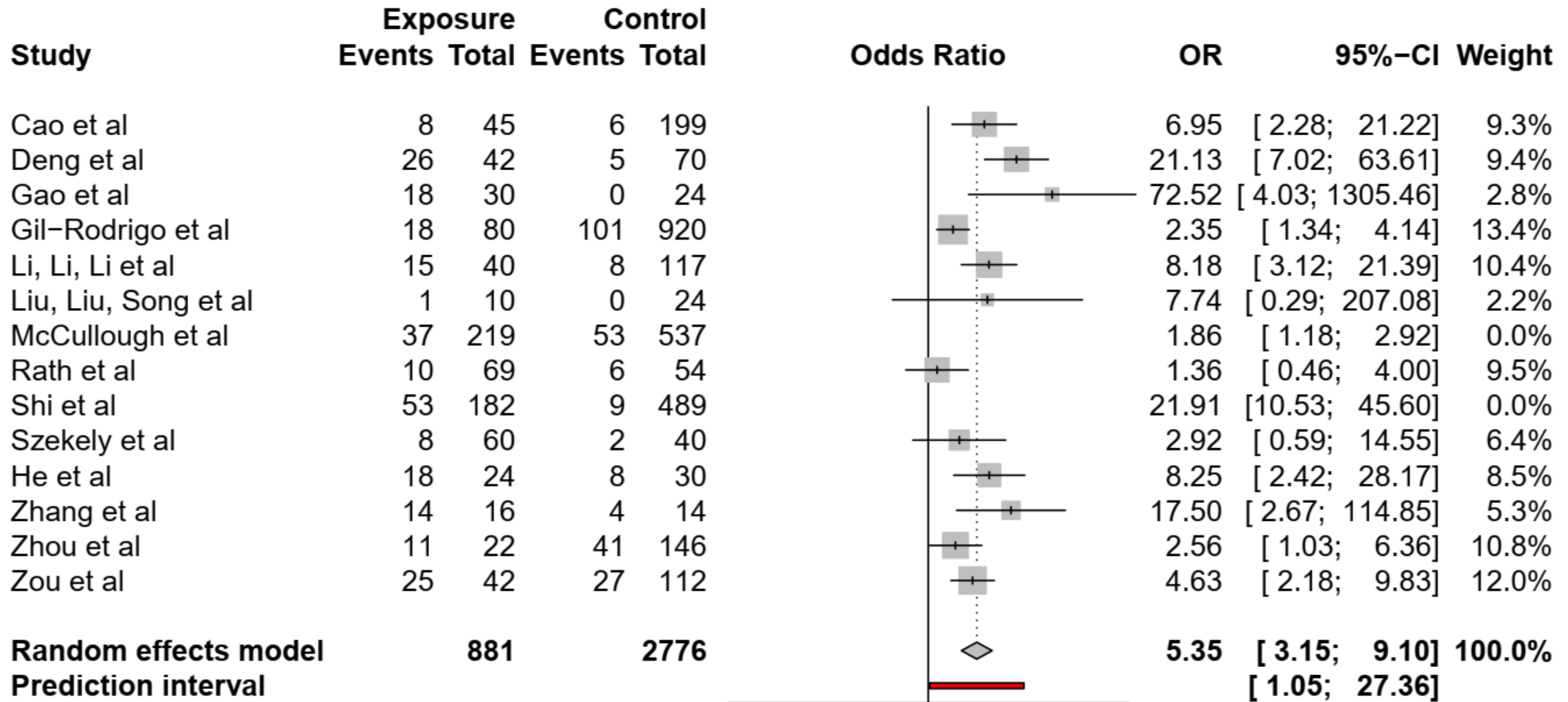
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	HetContrib	Influence	EffectSize
Omitting Nie et al	43.304		0.613
Omitting McCullough et al	22.733		11.047
Omitting Shi et al	13.345		0.020
Omitting Gil-Rodrigo et al	9.033		4.300
Omitting Rath et al	6.591		3.071
Omitting Deng et al	5.587		0.671
Omitting Pagnesi et al	4.045		2.355
Omitting Gao et al	3.020		0.913
Omitting Zhou et al	2.825		2.501
Omitting Chen et al	2.516		0.946
Omitting Knight et al	1.591		0.440
Omitting Zhang et al	1.413		1.254
Omitting Szekely et al	0.627		1.852
Omitting Li, Li, Li et al	0.600		1.266
Omitting He et al	0.386		1.341
Omitting Zou et al	0.241		1.918
Omitting Cao et al	0.147		1.437
Omitting Xu, Hou, Xu et al	0.069		1.481
Omitting Liu, Liu, Song et al	0.038		1.509

Cohort OR



# Pooled OR of Cohort Studies



Heterogeneity:  $I^2 = 61\%$ ,  $\tau^2 = 0.4628$ ,  $p < 0.01$

## Identified outliers (random-effects model)

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"McCullough et al", "Shi et al"

## Results with outliers removed

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	OR	95%-CI	%W (random)	exclude
Cao et al	6.9550	[ 2.2797; 21.2184]	9.3	
Deng et al	21.1250	[ 7.0152; 63.6139]	9.4	
Gao et al	72.5200	[ 4.0286; 1305.4562]	2.8	
Gil-Rodrigo et al	2.3542	[ 1.3394; 4.1380]	13.4	
Li, Li, Li et al	8.1750	[ 3.1243; 21.3904]	10.4	
Liu, Liu, Song et al	7.7368	[ 0.2891; 207.0783]	2.2	
McCullough et al	1.8565	[ 1.1800; 2.9208]	0.0	*
Rath et al	1.3559	[ 0.4598; 3.9986]	9.5	
Shi et al	21.9121	[10.5295; 45.5999]	0.0	*
Szekely et al	2.9231	[ 0.5872; 14.5500]	6.4	
He et al	8.2500	[ 2.4158; 28.1741]	8.5	
Zhang et al	17.5000	[ 2.6666; 114.8459]	5.3	
Zhou et al	2.5610	[ 1.0305; 6.3645]	10.8	
Zou et al	4.6296	[ 2.1802; 9.8309]	12.0	

Number of studies combined: k = 12

	OR	95%-CI	z	p-value
Random effects model	5.3549	[3.1523; 9.0965]	6.21	< 0.0001
Prediction interval		[1.0480; 27.3614]		

#### Quantifying heterogeneity:

$\tau^2 = 0.4628$ ;  $\tau = 0.6803$ ;  $I^2 = 60.8\%$  [26.3%; 79.1%];  $H = 1.60$  [1.16; 2.19]

#### Test of heterogeneity:

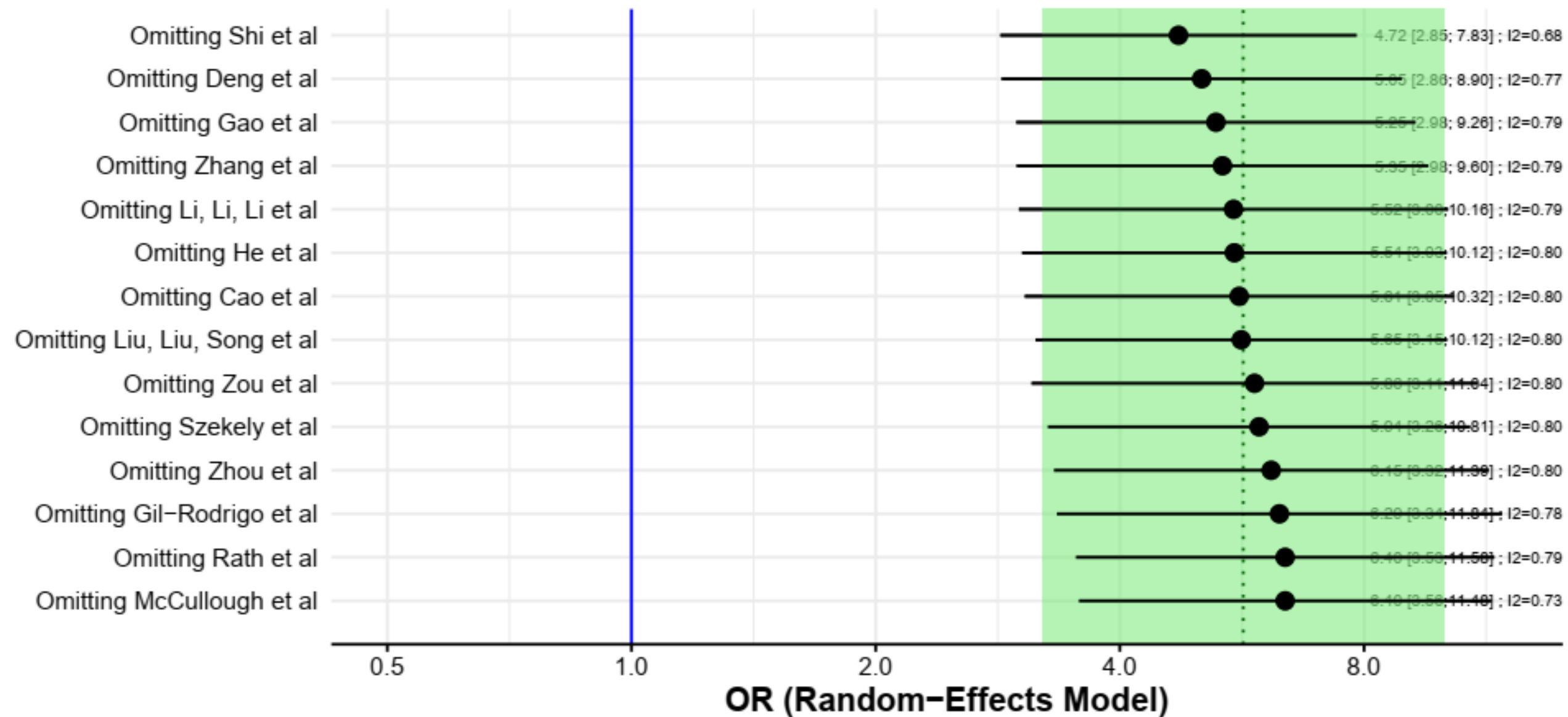
Q	d.f.	p-value
28.04	11	0.0032

#### Details on meta-analytical method:

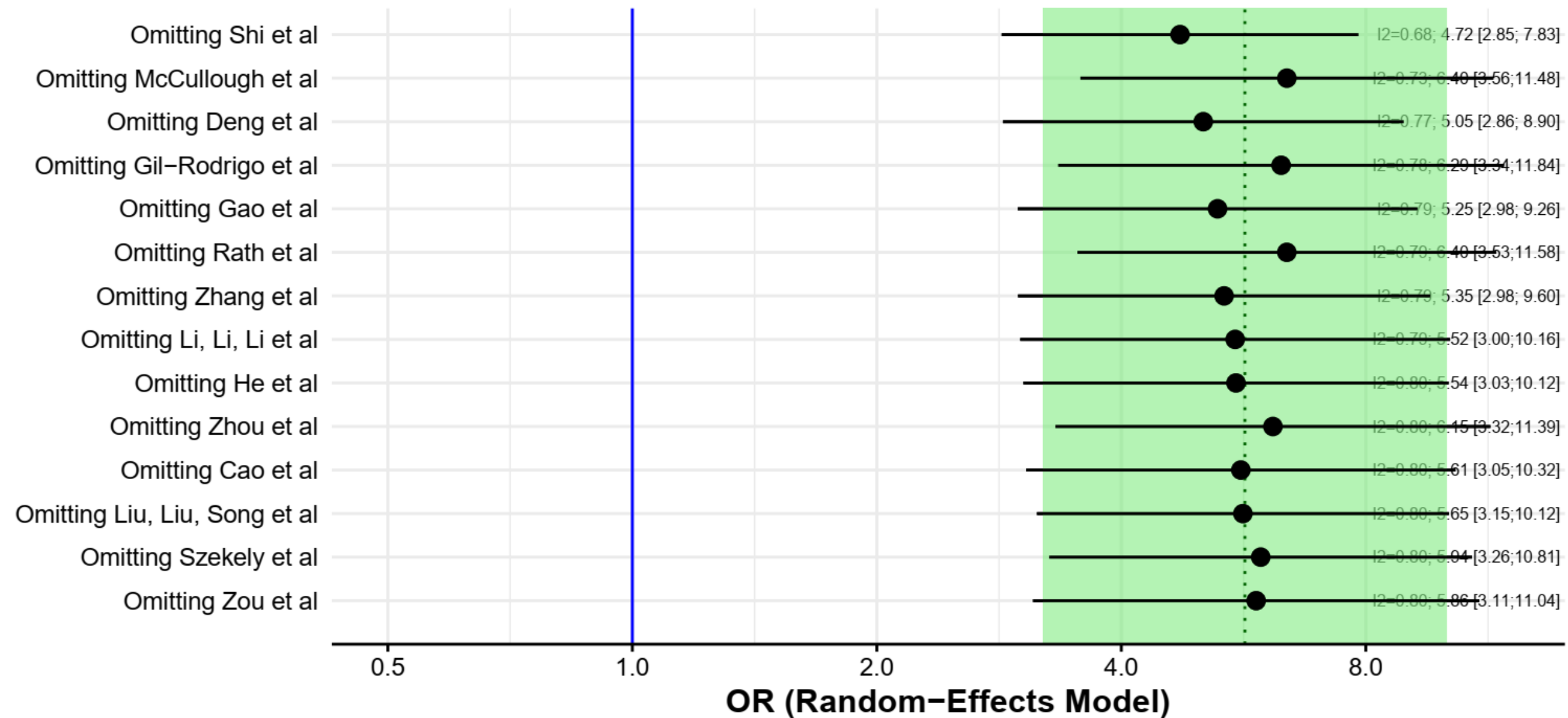
- Mantel-Haenszel method
- DerSimonian-Laird estimator for  $\tau^2$
- Mantel-Haenszel estimator used in calculation of Q and  $\tau^2$  (like RevMan 5)
- Continuity correction of 0.5 in studies with zero cell frequencies

# Influence Analysis of Cohort RR

## Sorted by Effect Size



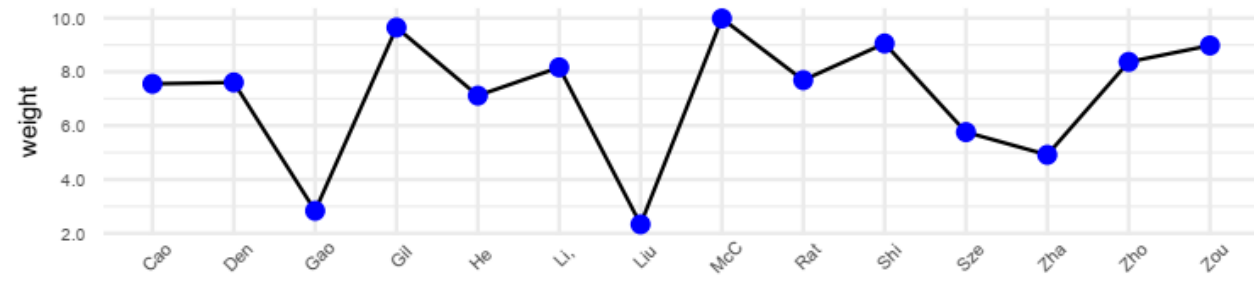
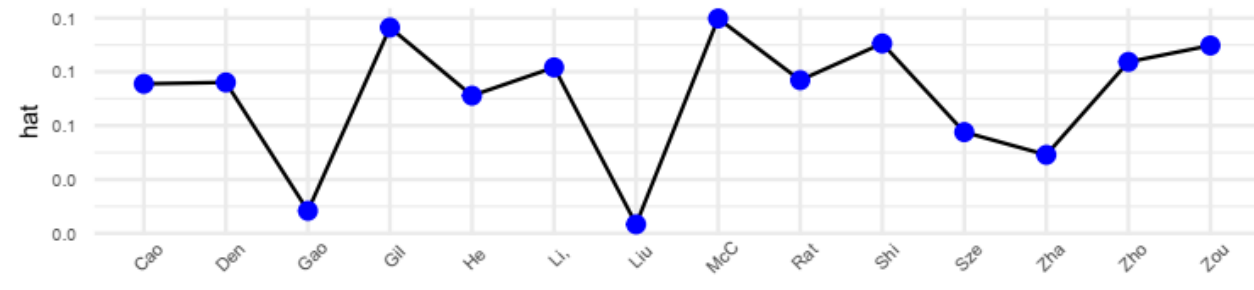
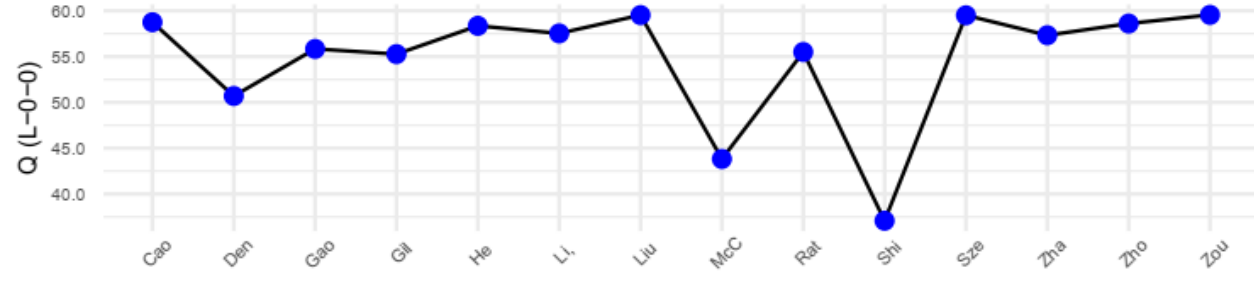
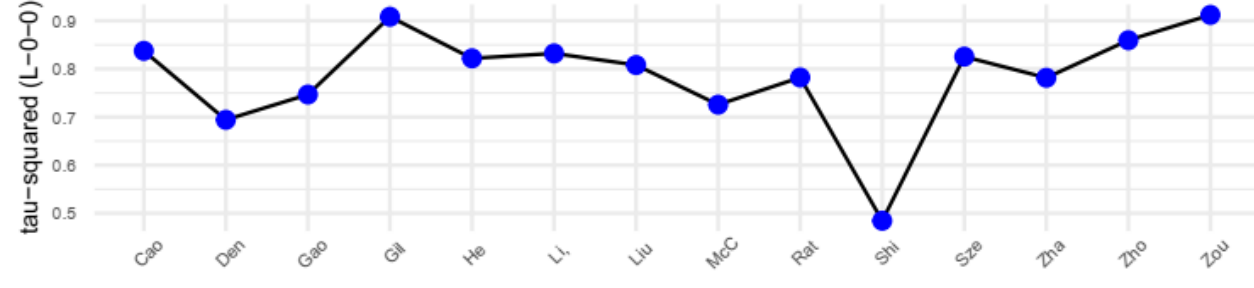
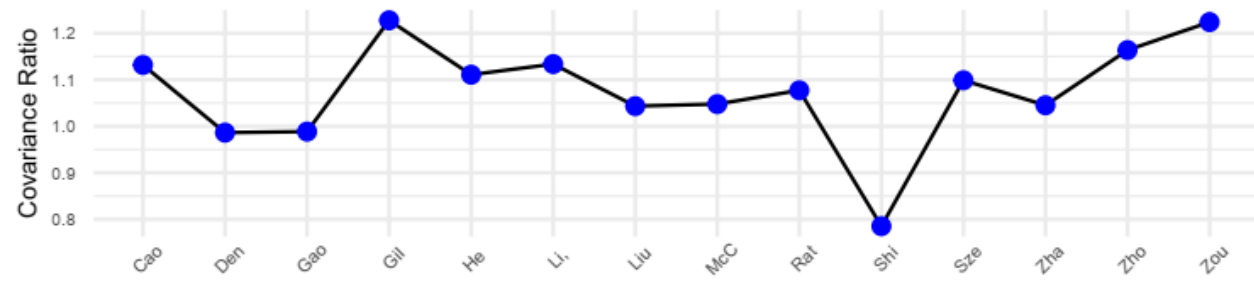
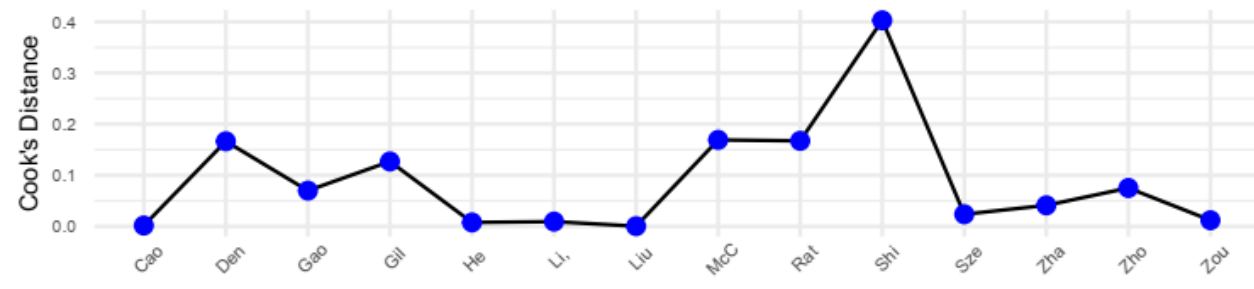
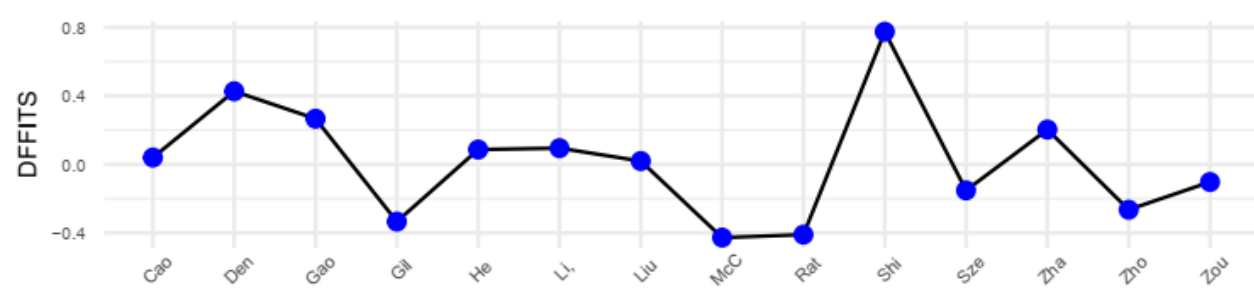
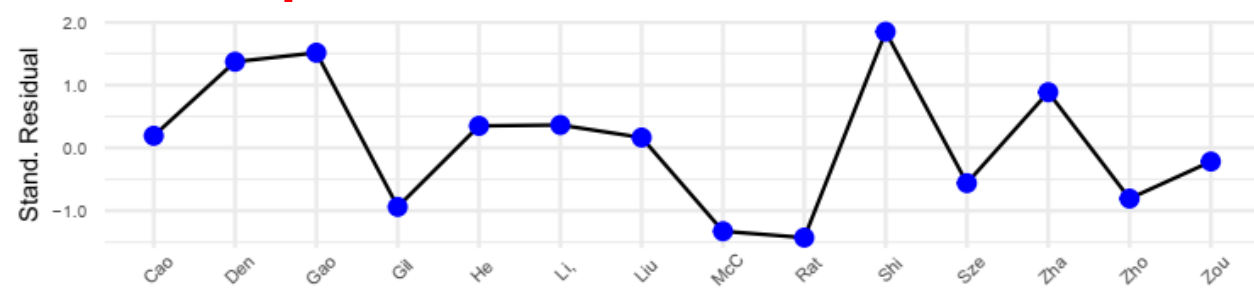
## Sorted by I-squared



## Leave-One-Out Analysis (Sorted by I2)

	Effect	LLCI	ULCI	I2
Omitting Shi et al	4.725	2.850	7.834	0.679
Omitting McCullough et al	6.396	3.562	11.484	0.730
Omitting Deng et al	5.046	2.859	8.905	0.767
Omitting Gil-Rodrigo et al	6.292	3.345	11.838	0.785
Omitting Gao et al	5.255	2.982	9.261	0.787
Omitting Rath et al	6.395	3.532	11.581	0.787
Omitting Zhang et al	5.353	2.984	9.604	0.793
Omitting Li, Li, Li et al	5.524	3.003	10.160	0.795
Omitting He et al	5.537	3.030	10.116	0.797
Omitting Zhou et al	6.147	3.318	11.388	0.798
Omitting Cao et al	5.613	3.054	10.318	0.799
Omitting Liu, Liu, Song et al	5.646	3.149	10.123	0.801
Omitting Szekely et al	5.939	3.261	10.814	0.801
Omitting Zou et al	5.862	3.114	11.038	0.801

# Influence plot of all cohort studies



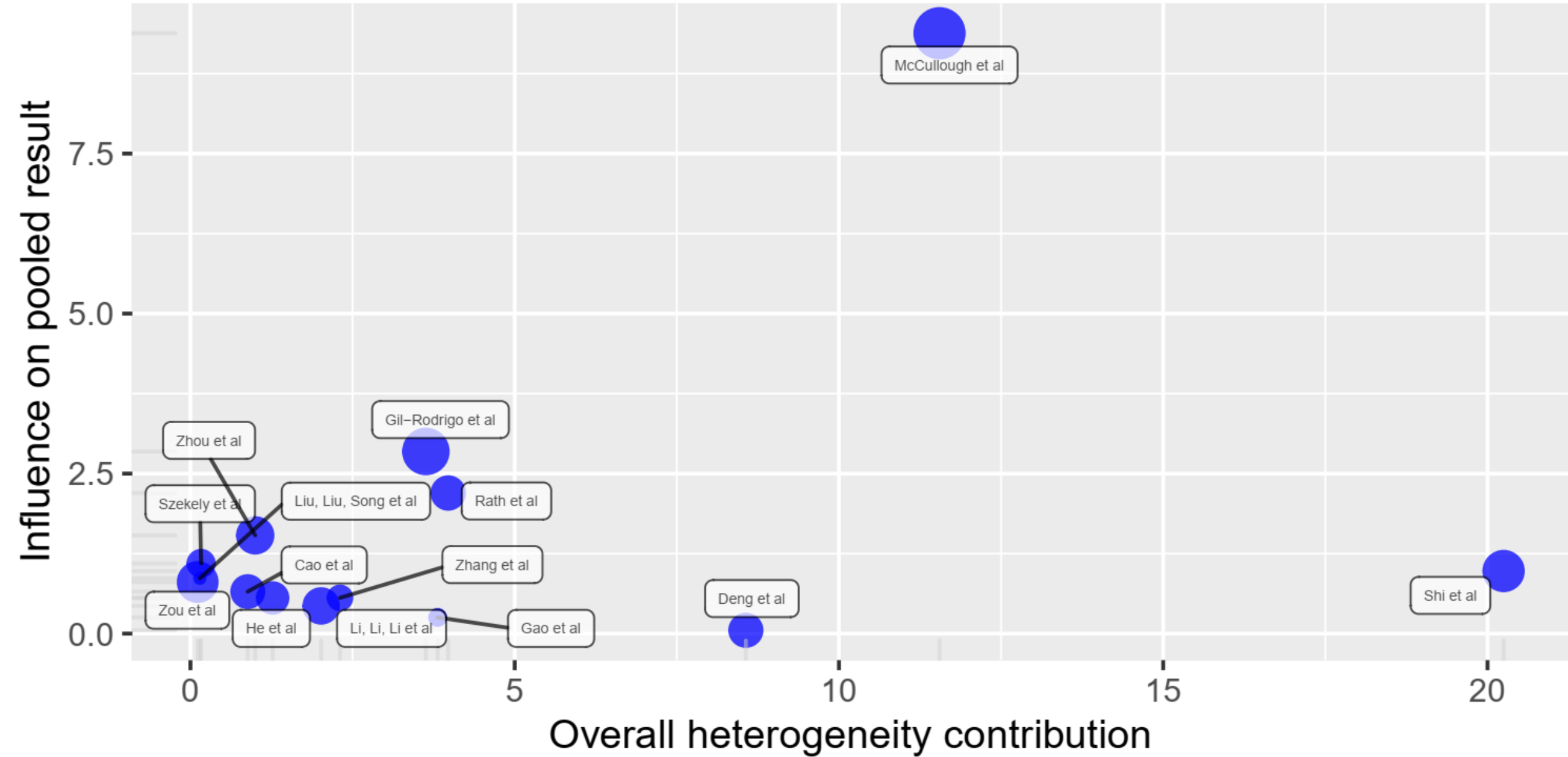


## Influence Diagnostics

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	rstudent	dffits	cook.d	cov.r	QE.del	hat	weight	infl
Omitting Cao et al	0.193	0.040	0.002	1.132	58.748	0.076	7.555	
Omitting Deng et al	1.371	0.426	0.166	0.986	50.697	0.076	7.606	
Omitting Gao et al	1.514	0.266	0.070	0.988	55.835	0.028	2.835	
Omitting Gil-Rodrigo et al	-0.939	-0.334	0.127	1.228	55.272	0.096	9.646	
Omitting Li, Li, Li et al	0.364	0.095	0.009	1.134	57.529	0.082	8.165	
Omitting Liu, Liu, Song et al	0.164	0.019	0.000	1.043	59.526	0.023	2.333	
Omitting McCullough et al	-1.327	-0.427	0.169	1.048	43.823	0.100	9.983	
Omitting Rath et al	-1.428	-0.410	0.167	1.077	55.500	0.077	7.689	
Omitting Shi et al	1.848	0.774	0.403	0.785	37.082	0.091	9.053	
Omitting Szekely et al	-0.561	-0.152	0.024	1.099	59.505	0.058	5.759	
Omitting He et al	0.350	0.086	0.008	1.111	58.356	0.071	7.115	
Omitting Zhang et al	0.886	0.203	0.041	1.045	57.330	0.049	4.914	
Omitting Zhou et al	-0.807	-0.265	0.075	1.164	58.602	0.084	8.369	
Omitting Zou et al	-0.218	-0.103	0.012	1.224	59.550	0.090	8.978	

Note how Shi et al and McCullough et al are outliers. (Baujat Plot)



# Baujat Diagnostics (sorted by Heterogeneity Contribution)

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	HetContrib	Influence	EffectSize
Omitting Shi et al	20.248		0.978
Omitting McCullough et al	11.551		9.380
Omitting Deng et al	8.564		0.052
Omitting Rath et al	3.974		2.197
Omitting Gao et al	3.812		0.253
Omitting Gil-Rodrigo et al	3.630		2.845
Omitting Zhang et al	2.306		0.559
Omitting Li, Li, Li et al	2.015		0.432
Omitting He et al	1.268		0.557
Omitting Zhou et al	0.998		1.535
Omitting Cao et al	0.884		0.656
Omitting Szekely et al	0.164		1.096
Omitting Liu, Liu, Song et al	0.146		0.864
Omitting Zou et al	0.111		0.805