

ITT and CACE Sign



You are an expert in microeconomics and public policy. Please help to answer the following problem:

As long as take-up of the treatment is greater in the treatment group than in the control group, the Intention to Treat (ITT) estimate will always have the same sign as the Complier Average Causal Effect (CACE) estimate (in other words, if the ITT is positive, the CACE will also be positive, and if the ITT is negative, the CACE will also be negative).

A. True

B. False

C. Don't know



The correct answer is:

A. True

Explanation:

The relationship between the **Intention to Treat (ITT)** estimate and the **Complier Average Causal Effect (CACE)** estimate hinges on the fact that:

- 1. **ITT** measures the average causal effect of being assigned to the treatment group, regardless of whether individuals actually comply with the treatment. It reflects the overall effect of the assignment, which includes both compliers and non-compliers.
- 2. **CACE** specifically measures the causal effect of the treatment on the subset of compliers—those who follow their assignment (e.g., those assigned to treatment who actually take it, and those assigned to control who do not take the treatment).
- 3. **Sign Relationship**: If take-up of the treatment is greater in the treatment group than in the control group, this implies there are some compliers. Since the ITT captures the "intention" effect and includes all individuals (compliers and non-compliers), the sign of the ITT reflects the overall effect of the treatment assignment. The CACE is derived by isolating the compliers' behavior, and its sign aligns with the ITT because it is computed using the ITT divided by the proportion of compliers.
 - Mathematically:

$$CACE = \frac{ITT}{Compliance\ Rate}$$

The compliance rate is positive by definition (greater treatment take-up in the treatment group than in the control group), so the sign of the CACE matches the ITT.



Thus, as long as the treatment group has a higher take-up rate than the control group, the ITT and CACE will always have the same sign.



From the problem and solution above, please extract all the core concepts behind it. Explain them from scratch.

Include some light humor in your explanation.



Let's break this problem into bite-sized chunks with some light humor sprinkled in. Here are the core concepts explained from scratch:

1. Intention to Treat (ITT):

Imagine you're a teacher assigning students to a fancy new online class (treatment) or leaving them with the usual boring chalkboard lessons (control). Whether or not students actually **show up** for the online class, you're still going to evaluate their performance based on the original assignment. Why? Because you're sticking to your **intention**—whether they followed it or decided Netflix was more appealing that day.

Takeaway: ITT measures the effect of the **assignment** (not actual participation). Think of ITT as the teacher saying, "I *intended* for you to be smart. The rest is on you."

2. Complier Average Causal Effect (CACE):

Now, among your students, there's a group called "compliers." These are the goody-two-shoes who do exactly what you tell them to—no Netflix, no distractions, just compliance. You're only interested in measuring how much the fancy online class helped *these specific students*. The CACE focuses on these angels.

Takeaway: CACE measures the effect of the treatment on the people who actually comply with their assignments. It's like saying, "Let's only evaluate the students who actually followed the rules and see how much they learned."

3. Compliance Rates and Sign Alignment:

Here's where it gets tricky but cool: If more students **take up the online class** in the treatment group than the control group, this difference tells us there are compliers. Since CACE isolates their impact, it scales the ITT effect by dividing it by the compliance rate. (Relax, no scary math here.)

And here's the magic: If the ITT says the online class helped (positive sign), the CACE will say, "Yes, and it helped even more for the rule-followers!" (Still positive.)

On the flip side, if ITT says the class was a flop (negative sign), CACE agrees but clarifies that even the compliers didn't benefit. They're like, "We followed the rules, but this was still a waste of time."

Takeaway: ITT and CACE always agree on whether the treatment was a blessing or a bust—no "he said, she said" drama here.



4. Why the Signs Always Match:

The sign alignment happens because:

- ITT captures the overall average effect, blending compliers and non-compliers.
- CACE zooms in on compliers only, but since they're a part of the ITT, their results are proportional to it.
- The compliance rate is positive (unless something is wildly wrong, like your control group sneaking into the online class).

Light humor analogy: ITT and CACE are like two friends gossiping about a party. ITT says, "The party was awesome!" CACE chimes in, "Totally! At least for the people who actually went." If ITT says, "The party sucked," CACE nods, "Yep, even for the ones who bothered to show up."

5. Take-Up Rates:

The key assumption in the problem is that the treatment group has a higher take-up rate than the control group. If this doesn't hold, well, chaos ensues, and ITT and CACE might not even get invited to the same metaphorical party anymore.

Light humor analogy: If your treatment group doesn't take up the treatment, it's like throwing a party but forgetting to send out invites. Who's going to show up? And how will you measure success? Spoiler: You can't.

Recap of Core Concepts with Humor:

- **ITT**: Measures the overall effect of the assignment, whether or not anyone actually shows up. Think of it as a teacher saying, "I tried, okay?"
- **CACE**: Measures the effect for the rule-followers (compliers). Think of it as evaluating just the teacher's pets.
- **Compliance Rate**: The proportion of compliers in the treatment group versus the control group. If this rate is positive, ITT and CACE will agree like two peas in a statistical pod.
- **Sign Alignment**: ITT and CACE are besties—they always agree on whether the treatment rocked or flopped, thanks to proportionality and positivity.

And there you have it—a statistical story that even includes a little party gossip!



please show a case example when ITT is negative.



Sure! Let's illustrate a case where **Intention to Treat (ITT)** is negative with a concrete example, wrapped in a relatable story:

Scenario: A Health Campaign Gone Wrong



Objective: A government wants to reduce smoking rates by offering a free stop-smoking patch to a randomly selected group (treatment group). The rest (control group) receives no intervention.

Study Design:

- 1. **Treatment Group**: Individuals assigned to receive the free smoking patch.
- 2. **Control Group**: Individuals who do not receive the patch.

Outcome of Interest: The change in average cigarette consumption per day after the intervention.

What Happens?

- Some people in the **treatment group** don't use the patch. (They're either skeptical, lazy, or just enjoy smoking too much.)
- Meanwhile, some in the **control group** decide to quit smoking on their own, inspired by all the buzz around the campaign.
- Surprisingly, for the treatment group that does use the patch, the side effects are severe (e.g., headaches or mood swings), causing many to *smoke even more* to deal with the stress.

Results:

- 1. **Treatment Group** (average cigarettes/day):
 - Before the intervention: 10 cigarettes/day
 - After the intervention: 12 cigarettes/day (average increase of +2 cigarettes/day).
- 2. Control Group (average cigarettes/day):
 - Before the intervention: 10 cigarettes/day
 - After the intervention: 8 cigarettes/day (average decrease of -2 cigarettes/day).

ITT Calculation:

ITT measures the difference in outcomes between the treatment and control groups, regardless of compliance.

ITT = Average outcome (Treatment) - Average outcome (Control)

$$ITT = 12 - 8 = -4$$

Interpretation:

The **ITT estimate is negative**, meaning that being assigned to the treatment group led to worse outcomes on average compared to the control group.

Why This Happens:

- 1. The **non-compliance** in the treatment group diluted the positive effects of the patch.
- 2. The **control group self-motivated** and achieved better outcomes without the patch.
- 3. The **adverse effects** of the patch in the treatment group actually caused more harm than good.



Humor to Lighten the Mood:

This is like the government trying to help by saying, "Here's a patch to make you healthier!" but accidentally handing out a patch that says, "Stress harder, smoke more!" Meanwhile, the control group is like, "We'll just quit quietly without your help, thanks."

Key Takeaway:

ITT can be negative when the treatment assignment unintentionally leads to worse outcomes in the treatment group compared to the control group. It highlights that sometimes even well-intentioned interventions can backfire.



Please generate some relevant T/F questions, and show the solution.



Here are some **True/False questions** based on the concept of **Intention to Treat (ITT)** and **Complier Average Causal Effect (CACE)**:

Question 1:

The Intention to Treat (ITT) estimate is always positive.

Answer: False

• ITT can be negative if the treatment group performs worse on average compared to the control group. For example, if an intervention causes unintended negative effects (e.g., side effects of a stop-smoking patch increase smoking), the ITT estimate would be negative.

Question 2:

The ITT estimate reflects the effect of treatment assignment, regardless of compliance.

Answer: True

• ITT measures the average causal effect of being assigned to the treatment group, whether or not individuals actually comply with the treatment.

Question 3:

The Complier Average Causal Effect (CACE) is calculated by isolating the effect on individuals who comply with their assignment.

Answer: True

• CACE specifically estimates the causal effect for compliers, those who follow their assigned treatment or control condition.



Question 4:

As long as take-up of the treatment is greater in the treatment group than in the control group, ITT and CACE will always have the same sign.

Answer: True

• If the treatment take-up rate is higher in the treatment group, the CACE (scaled from ITT) will always have the same sign as ITT because compliance rate is positive.

Question 5:

If the control group takes up the treatment at a higher rate than the treatment group, CACE can be undefined.

Answer: True

• CACE relies on a clear difference in compliance between treatment and control groups. If the control group takes up the treatment more than the treatment group, the compliance assumption is violated, and CACE may become meaningless or undefined.

Question 6:

When compliance rates are low, the ITT estimate will still provide a reliable measure of the causal effect for compliers.

Answer: False

• ITT reflects the average effect of assignment, not compliance. Low compliance rates dilute the effect in ITT, making it less reflective of the causal effect on compliers.

Question 7:

CACE can have a different sign from ITT if the compliance rate is negative.

Answer: False

• Compliance rates are non-negative (you can't have less than zero compliance). Therefore, ITT and CACE will always have the same sign as long as compliance exists.

Question 8:

ITT is useful for understanding the real-world effectiveness of an intervention, even if compliance is imperfect.

Answer: True

• ITT reflects the effect of simply being assigned to a treatment, making it a practical measure of an intervention's real-world impact, where compliance is often incomplete.

Question 9:



The CACE estimate can be larger in magnitude than the ITT estimate.

Answer: True

• CACE isolates the treatment effect on compliers, removing the dilution caused by non-compliers in ITT. This often results in a larger magnitude for CACE compared to ITT.

Question 10:

If no one in the treatment group complies, the CACE estimate will be zero.

Answer: True

• If there are no compliers, CACE cannot be calculated because it requires compliance to estimate the causal effect for that subgroup.

These questions help reinforce key concepts related to ITT and CACE, focusing on their definitions, relationships, and practical implications.