Supplement 1: Step-by-Step Deconfounding
Step I: draw a large X through descendants of treatment (mediators)

| \# | ITFC $\leftarrow \rightarrow$ PRTF | C | BH | P | A | E | Dr | DS |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | $\mathrm{C} \rightarrow \mathrm{BH}$ | C | BH |  |  |  |  |  |
| 2 | C | C |  |  |  |  |  |  |
| 3 | $\mathrm{C} \rightarrow \mathrm{P} \rightarrow \mathrm{A} \rightarrow \mathrm{BH}$ | C | BH | P | A |  |  |  |
| 4 | $\mathrm{C} \rightarrow \mathrm{A} \rightarrow \mathrm{BH}$ | C | BH |  | A |  |  |  |
| 5 | $\mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{BH}$ | C | BH |  |  | E | Dr | DS |
| 6 | $\mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{A} \rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr | DS |
| 7 | $\mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{A} \rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr |  |
| 8 | $\mathrm{A} \rightarrow \mathrm{BH}$ |  | BH |  | A |  |  |  |
| 9 | $\mathrm{A} \leftarrow \mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr | DS |
| 10 | $\mathrm{A} \leftarrow \mathrm{C} \rightarrow \mathrm{BH}$ | C | BH |  | A |  |  |  |
| 11 | $\mathrm{A} \leftarrow \mathrm{C}$ | C |  |  | A |  |  |  |
| 12 | $\mathrm{A} \leftarrow \mathrm{P} \leftarrow \mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{BH}$ | C | BH | P | A | E | Dr | DS |
| 13 | $\mathrm{A} \leftarrow \mathrm{P} \leftarrow \mathrm{C} \rightarrow \mathrm{BH}$ | C | BH | P | A |  |  |  |
| 14 | $\mathrm{A} \leftarrow \mathrm{P} \leftarrow \mathrm{C}$ | C |  | P | A |  |  |  |
| 15 | $\mathrm{A} \leftarrow \mathrm{Dr} \leftarrow \mathrm{E} \leftarrow \mathrm{C} \rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr |  |
| 16 | $\mathrm{A} \leftarrow \mathrm{Dr} \leftarrow \mathrm{E} \leftarrow \mathrm{C}$ | C |  |  | A | E | Dr |  |
| 17 | $\mathrm{A} \leftarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{BH}$ |  | BH |  | A |  | Dr | DS |
| 18 | $\mathrm{A} \leftarrow \mathrm{DS} \leftarrow \mathrm{Dr} \leftarrow \mathrm{E} \leftarrow \mathrm{C} \rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr | DS |
| 19 | $\mathrm{A} \leftarrow \mathrm{DS} \leftarrow \mathrm{Dr} \leftarrow \mathrm{E} \leftarrow \mathrm{C}$ | C |  |  | A | E | Dr | DS |
| 20 | $\mathrm{A} \leftarrow \mathrm{DS} \rightarrow \mathrm{BH}$ |  | BH |  | A |  |  | DS |

Step II: draw a box around the remaining columns containing variables that are colliders.

| \# | $\mathrm{ITFC} \leftarrow \quad \rightarrow$ PRTF | C | BH | P | A | E | Dr | DS |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | $\mathrm{C} \rightarrow \mathrm{BH}$ | C | BH |  |  |  |  |  |
| 2 | C | C |  |  |  |  |  |  |
| 3 | $\mathrm{C} \rightarrow \mathrm{P} \rightarrow \mathrm{A} \rightarrow \mathrm{BH}$ | C | BH | P | A |  |  |  |
| 4 | $\mathrm{C} \rightarrow \mathrm{A} \rightarrow \mathrm{BH}$ | C | BH |  | A |  |  |  |
| 5 | $\mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{BH}$ | C | BH |  |  | E | Dr | DS |
| 6 | $\mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{A} \rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr | DS |
| 7 | $\mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{A} \rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr |  |
| 8 | $\mathrm{A} \rightarrow \mathrm{BH}$ |  | BH |  | A |  |  |  |
| 9 | $\mathrm{A} \leftarrow \mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow$ DS $\rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr | DS |
| 10 | $\mathrm{A} \leftarrow \mathrm{C} \rightarrow \mathrm{BH}$ | C | BH |  | A |  |  |  |
| 11 | $\mathrm{A} \leftarrow \mathrm{C}$ | C |  |  | A |  |  |  |
| 12 | $\mathrm{A} \leftarrow \mathrm{P} \leftarrow \mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{BH}$ | C | BH | P | A | E | Dr | DS |
| 13 | $\mathrm{A} \leftarrow \mathrm{P} \leftarrow \mathrm{C} \rightarrow \mathrm{BH}$ | C | BH | P | A |  |  |  |
| 14 | $\mathrm{A} \leftarrow \mathrm{P} \leftarrow \mathrm{C}$ | C |  | P | A |  |  |  |
| 15 | $\mathrm{A} \leftarrow \mathrm{Dr} \leftarrow \mathrm{E} \leftarrow \mathrm{C} \rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr |  |
| 16 | $\mathrm{A} \leftarrow \mathrm{Dr} \leftarrow \mathrm{E} \leftarrow \mathrm{C}$ | C | - |  | A | E | Dr |  |
| 17 | $\mathrm{A} \leftarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{BH}$ |  | BH |  | A |  | Dr | DS |
| 18 | $\mathrm{A} \leftarrow \mathrm{DS} \leftarrow \mathrm{Dr} \leftarrow \mathrm{E} \leftarrow \mathrm{C} \rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr | DS |
| 19 | $\mathrm{A} \leftarrow \mathrm{DS} \leftarrow \mathrm{Dr} \leftarrow \mathrm{E} \leftarrow \mathrm{C}$ | C |  |  | A | E | Dr | DS |
| 20 | $\mathrm{A} \leftarrow \mathrm{DS} \rightarrow \mathrm{BH}$ |  | BH |  | A |  |  | DS |

Step III: circle the confounders that are alone in their rows ( C in row 1 and A in row 8 ).

| \# | $\mathrm{ITFC} \leftarrow \rightarrow$ PRTF | C | BH | P | A | E | Dr | DS |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | $\mathrm{C} \rightarrow \mathrm{BH}$ | C | BH |  |  |  |  |  |
| 2 | C | C |  |  |  |  |  |  |
| 3 | $\mathrm{C} \rightarrow \mathrm{P} \rightarrow \mathrm{A} \rightarrow \mathrm{BH}$ | C | 3H | P | A |  |  |  |
| 4 | $\mathrm{C} \rightarrow \mathrm{A} \rightarrow \mathrm{BH}$ | C | BH |  | A |  |  |  |
| 5 | $\mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{BH}$ | C | BH |  |  | E | Dr | DS |
| 6 | $\mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{A} \rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr | DS |
| 7 | $\mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{A} \rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr |  |
| 8 | $\mathrm{A} \rightarrow \mathrm{BH}$ |  | BH |  | A |  |  |  |
| 9 | $\mathrm{A} \leftarrow \mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr | DS |
| 10 | $\mathrm{A} \leftarrow \mathrm{C} \rightarrow \mathrm{BH}$ | C | BH |  | A |  |  |  |
| 11 | $\mathrm{A} \leftarrow \mathrm{C}$ | C |  |  | A |  |  |  |
| 12 | $\mathrm{A} \leftarrow \mathrm{P} \leftarrow \mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{BH}$ | C | BH | P | A | E | Dr | DS |
| 13 | $\mathrm{A} \leftarrow \mathrm{P} \leftarrow \mathrm{C} \rightarrow \mathrm{BH}$ | C | BH | P | A |  |  |  |
| 14 | $\mathrm{A} \leftarrow \mathrm{P} \leftarrow \mathrm{C}$ | C |  | P | A |  |  |  |
| 15 | $\mathrm{A} \leftarrow \mathrm{Dr} \leftarrow \mathrm{E} \leftarrow \mathrm{C} \rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr |  |
| 16 | $\mathrm{A} \leftarrow \mathrm{Dr} \leftarrow \mathrm{E} \leftarrow \mathrm{C}$ | C | - |  | A | E | Dr |  |
| 17 | $\mathrm{A} \leftarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{BH}$ |  | BH |  | A |  | Dr | DS |
| 18 | $\mathrm{A} \leftarrow \mathrm{DS} \leftarrow \mathrm{Dr} \leftarrow \mathrm{E} \leftarrow \mathrm{C} \rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr | DS |
| 19 | $\mathrm{A} \leftarrow \mathrm{DS} \leftarrow \mathrm{Dr} \leftarrow \mathrm{E} \leftarrow \mathrm{C}$ | C | - |  | A | E | Dr | DS |
| 20 | $\mathrm{A} \leftarrow \mathrm{DS} \rightarrow \mathrm{BH}$ |  | BH |  | A |  |  | DS |

Step IV: Cross off any other paths that include these confounders (all rows except 1 and 8.) A, as shown, is a collider, requiring some additional steps to ensure that conditioning does not induce bias.

| \# | $\mathrm{ITFC} \leftarrow \rightarrow$ PRTF | C | BH | P | A | E | Dr | DS |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | $\mathrm{C} \rightarrow \mathrm{BH}$ |  | BH |  |  |  |  |  |
| 2 | C |  |  |  |  |  |  |  |
| 3 | $\mathrm{C} \rightarrow \mathrm{P} \rightarrow \mathrm{A} \rightarrow \mathrm{BH}$ | C | BH | P | A |  |  |  |
| 4 | $\mathrm{C} \rightarrow \mathrm{A} \rightarrow \mathrm{BH}$ | C | BH |  | A |  |  |  |
| 5 | $\mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{BH}$ | C | BH |  |  | E | Dr | DS |
| 6 | $\mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{A} \rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr | DS |
| 7 | $\mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{A} \rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr |  |
| 8 | $\mathrm{A} \rightarrow \mathrm{BH}$ |  | BH |  | A |  |  |  |
| 9 | $\mathrm{A} \leftarrow \mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{BH}$ | C |  |  | A | E | Dr | DS |
| 10 | $\mathrm{A} \leftarrow \mathrm{C} \rightarrow \mathrm{BH}$ | C | BH |  | A |  |  |  |
| 11 | $\mathrm{A} \leftarrow \mathrm{C}$ | C |  |  | A |  |  |  |
| 12 | $\mathrm{A} \leftarrow \mathrm{P} \leftarrow \mathrm{C} \rightarrow \mathrm{E} \rightarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{BH}$ | C | BH | P | A | E | Dr | DS |
| 13 | $\mathrm{A} \leftarrow \mathrm{P} \leftarrow \mathrm{C} \rightarrow \mathrm{BH}$ | C |  | P | A |  |  |  |
| 14 | $\mathrm{A} \leftarrow \mathrm{P} \leftarrow \mathrm{C}$ | C |  | P | A |  |  |  |
| 15 | $\mathrm{A} \leftarrow \mathrm{Dr} \leftarrow \mathrm{E} \leftarrow \mathrm{C} \rightarrow \mathrm{BH}$ |  | BH |  | A | E | Dr |  |
| 16 | $\mathrm{A} \leftarrow \mathrm{Dr} \leftarrow \mathrm{E} \leftarrow \mathrm{C}$ | C |  |  | A | E | Dr |  |
| 17 | $\mathrm{A} \leftarrow \mathrm{Dr} \rightarrow \mathrm{DS} \rightarrow \mathrm{BH}$ |  | BH |  | A |  | Dr | DS |
| 18 | $\mathrm{A} \leftarrow \mathrm{DS} \leftarrow \mathrm{Dr} \leftarrow \mathrm{E} \leftarrow \mathrm{C} \rightarrow \mathrm{BH}$ | C | BH |  | A | E | Dr | DS |
| 19 | $\mathrm{A} \leftarrow \mathrm{DS} \leftarrow \mathrm{Dr} \leftarrow \mathrm{E} \leftarrow \mathrm{C}$ | C |  |  | A | E | Dr | DS |
| 20 | $\mathrm{A} \leftarrow \mathrm{DS} \rightarrow \mathrm{BH}$ |  | BH |  | A |  |  | DS |

