

Depression for Economists

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 - ▶ Simple economic model that generates the core symptoms of depression through changes in economic primitives, e.g. beliefs

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- ▶ Increase in temptation good consumption (e.g. tobacco), decrease in investment good expenditure (e.g. education)
- ▶ Can generate a poverty trap when beliefs are so pessimistic that agents fall back on the low-return “safe” activity and stop learning about returns to effort

Short History of Depression: Aaron T. Beck



Short History of Depression in Psychology/Psychiatry

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- ▶ Focus on “distorted thoughts” as the source of depression
- ▶ Standard treatment: Cognitive-Behavioral Therapy (CBT)
 - ▶ Main aim: correct distorted thoughts

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Our interpretation: pessimistic beliefs about returns to effort, and their consequences

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Our interpretation: consequences of pessimistic beliefs about the returns to effort (with suicidal wishes being an extreme form of escapism)

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Our interpretation:

- ▶ 1., 4., 6.: Consequences of pessimistic beliefs
- ▶ 2., 3., 5.: Low marginal utility of consumption of experiences
⇒ **difficult to interpret as pessimistic beliefs about returns to effort**

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- ▶ 3., 4.: Difficult to accommodate

Somatic Symptoms (DSM-V)

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2. Insomnia or hypersomnia
3. Psychomotor agitation or retardation

Indonesia Family Life Survey 2014–2015, $N = 50,148$ (16,204 households)

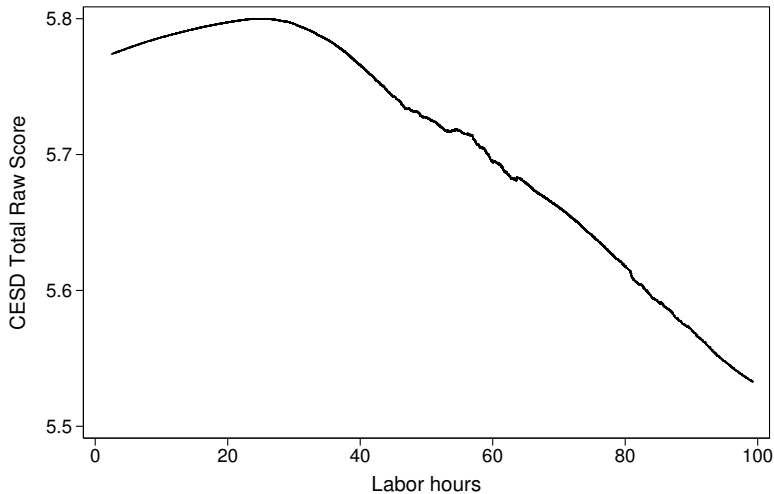
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1. Depression and economic shocks
2. Depression and labor supply
3. Depression and total consumption
4. Depression and weight: BMI
5. Depression and sleep
6. Depression and investment goods: education
7. Depression and temptation goods: tobacco

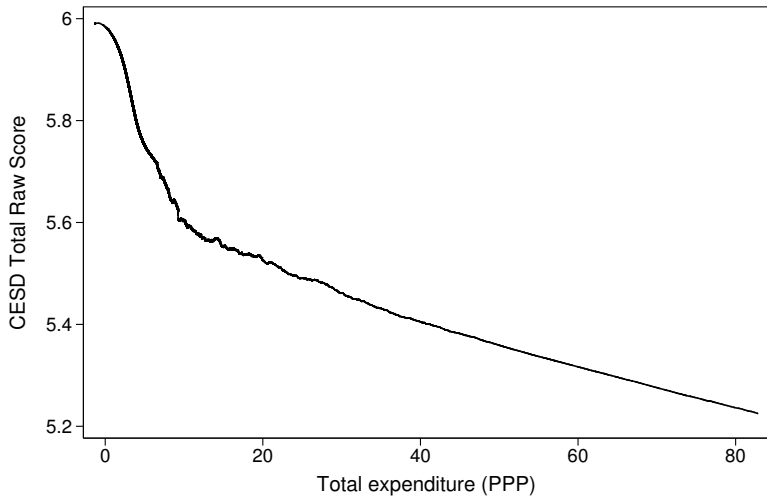
Depression and economic shocks

	(1) CESD Total Raw Score	(2) CESD Total Z-Score	(3) N
HH Business shut down in last 18 months	0.8077*** (0.2367)	0.1902*** (0.0557)	13095
Experienced natural disaster or civil strife	0.3967*** (0.0695)	0.0934*** (0.0164)	31401
Experienced economic disruption	0.5800*** (0.0703)	0.1366*** (0.0166)	31401

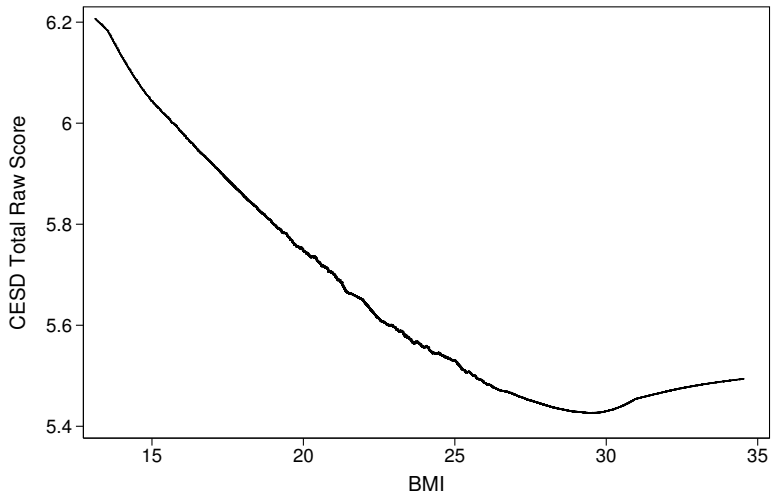
Depression and labor supply



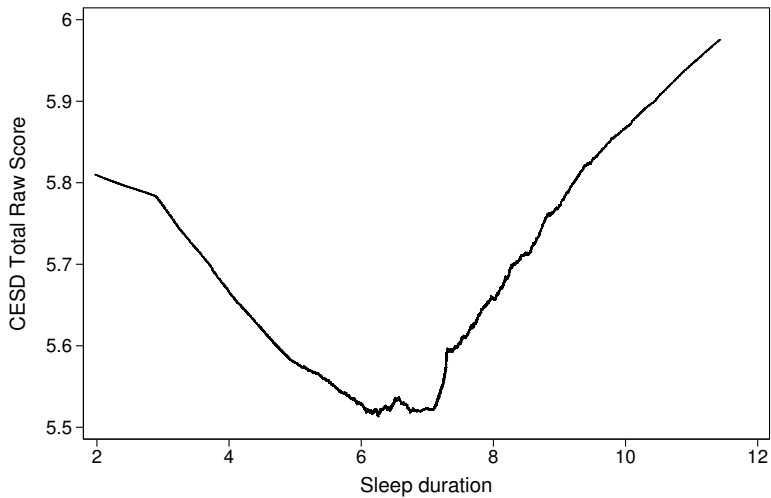
Depression and Total Consumption



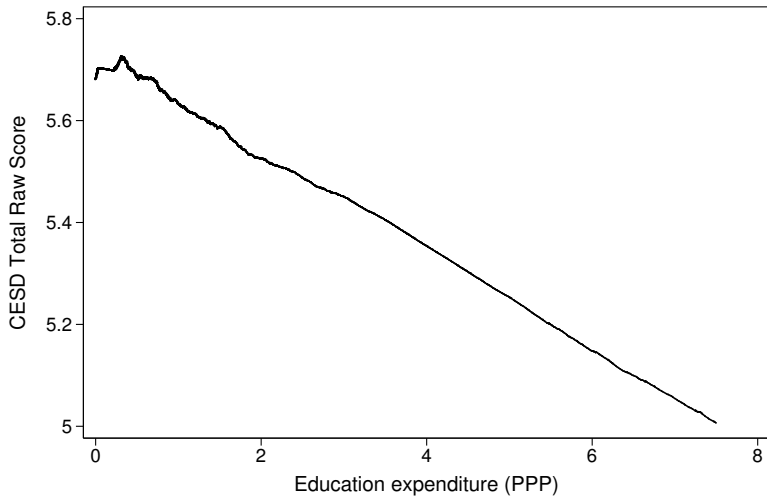
Depression and BMI



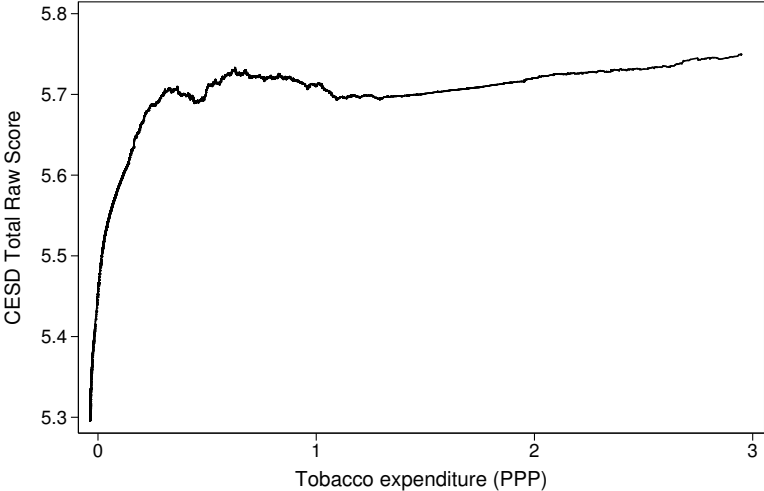
Depression and Sleep



Depression and Education Expenditure



Depression and Tobacco Expenditure



- ▶ Simple one-period setup

The Model: Intuition

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- ▶ Exogenous shock to beliefs about returns to labor effort
- ▶ Adjustment in behaviors complementary to beliefs about returns to effort
- ▶ Goal: make only one simple assumption to account for as many of the stylized facts as possible

$$U(c, f, s) = c + \phi(f) + \psi(s) \quad (1)$$

- ▶ c : Non-food consumption
- ▶ f : Food consumption
- ▶ s : Sleep
- ▶ Unique utility-maximizing levels f^C and s^C of food and sleep consumption: $\phi'(f^C) = \psi'(s^C) = 0$

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$$y(f, s) = ((1 - l)\bar{A} + lA) [\Phi(f) + \Psi(s)] + \varepsilon \quad (2)$$

- ▶ f : Food consumption
- ▶ s : Sleep
- ▶ l : Labor supply, $l \in \{0, 1\}$
- ▶ \bar{A} , A : Returns to low and high labor effort, respectively
- ▶ ε : Random shock
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 - ▶ Φ and Ψ are decreasing for sufficiently high levels of food and sleep consumption
 - ▶ E.g. obesity harms productivity
 - ▶ E.g. too much sleep reduces labor supply

Budget constraint with subjective beliefs

Agent observes y , but doesn't observe A ; instead forms beliefs μ over A

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Production:

$$y(f, s) = ((1 - l)\bar{A} + \mu l) [\Phi(f) + \Psi(s)] + \varepsilon$$

Budget constraint:

$$c + f = ((1 - l)\bar{A} + \mu l) [\Phi(f) + \Psi(s)] + \varepsilon \quad (3)$$

Depression as pessimistic beliefs about returns to effort

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- ▶ Implications for observed behavior are the same

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- ▶ Agents supply high levels of effort when expected returns exceed those from supplying low levels
- ▶ When $\mu < \bar{A} < A$, i.e. agent has depressed beliefs about A , she inefficiently chooses low effort, leading to lower income and consumption

Maximization: Food and Sleep

Food – extreme cases:

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In general, optimum lies between the extremes (i.e. consumption and production optima)

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$$\frac{df^*}{d\mu} = -\frac{\Phi'(f^*)}{\phi''(f^*) + \mu\Phi''(f^*)} \leq 0 \Leftrightarrow f^* \geq f^P$$
$$\frac{ds^*}{d\mu} = -\frac{\Psi'(s^*)}{\psi''(s^*) + \mu\Psi''(s^*)} \leq 0 \Leftrightarrow s^* \geq s^P$$

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- ▶ Intuitively: depressed people drift towards their natural tendencies

Effect of pessimistic beliefs on total consumption

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- ▶ Empirically, effect of depression on total consumption/total utility is (likely) negative
- ▶ Mirrored in the model: downward shock to μ unambiguously decreases total consumption and utility. Two sources:
 1. When $\mu < \bar{A} < A$, agents choose low effort, reducing income
 2. When $\bar{A} < \mu < A$, choose food and sleep suboptimally, reducing income

Extension I: Temptation and Investment Goods

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- ▶ Negative shocks to μ decrease in the importance of production motives:
 - ▶ \implies Decrease optimal level of investment goods
 - ▶ \implies Increase optimal level of temptation goods

Extension II: Poverty traps

- ▶ Shock to μ leads to inefficient levels of food consumption and sleep, but high effort provision ($l = 1$): learn true A over time

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- ▶ Shock to μ leads to inefficient levels of food consumption and sleep, but high effort provision ($l = 1$): learn true A over time
- ▶ Shock to μ leads to low effort provision ($l = 0$): stop learning about A; **depression poverty trap** with low income and consumption and persistently depressed beliefs about return to effort

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- ▶ Agents observe y_{t-1} and form the posterior:

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- ▶ Crucial result: when σ_ε^2 small relative to σ_A^2 , beliefs highly susceptible to pessimism following shock

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$$\mu_t = \mu_{t-1} + \frac{\sigma_{A,t-1}^2}{\sigma_{A,t-1}^2 + \frac{\sigma_\varepsilon^2}{(\phi(f_{t-1}) + \psi(s_{t-1}))^2}} \left(A - \mu_{t-1} + \frac{\varepsilon_{t-1}}{\phi(f_{t-1}) + \psi(s_{t-1})} \right)$$

- ▶ Crucial result: when σ_ε^2 small relative to σ_A^2 , beliefs highly susceptible to pessimism following shock
- ▶ This mirrors the fact that empirically, depression is especially likely to arise from stressors over which individuals believe they have control (Kendler et al., 1999)

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- ▶ Can generate a poverty trap when agents exert such low effort that they stop learning about their returns to effort

EXTRA SLIDES

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9. Recurrent thoughts of death, suicidal ideation