

# The Correlates of Nuclear Proliferation

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# Introduction

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Concerns about nuclear proliferation has grown

- Withdrawal of superpower security after the Cold War
- Technological progress for many countries to develop atomic weapon
- Possibility of nuclear power passed into terrorist organization

→ What causes nuclear proliferation?

# How to do research①

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## ●Quantitative test(+Qualitative and Comparative study)

→quantitative analyses that include observations covering the full range of variance on both the dependent and independent variables can provide a useful complement to qualitative approaches

## Defining four stages (Multilevel Indicator≡Dependent Variable)

1. No noticeable interest in nuclear weapon
2. Serious exploration of the weapons option
3. Launch of a weapons program
4. Acquisition of nuclear weapons

# How to do research②

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3 broad approaches to nuclear proliferation to test hypotheses(Independent Variable)

1. Technological determinants
2. External determinants
3. Internal determinants

# Dependent Variable

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The measurement for multilevel indicator is dependent variable

1. First explosion/assembly of weapons (acquisition)
2. Pursuit of weapons

Political decision by cabinet-level officials, movement toward weaponization, or development of single-use, dedicated technology in order to aim at acquiring nuclear weapon.

3. Exploration of weapons

# Technological Determinants

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3 measurements to know the latent capacity to develop nuclear weapon

1. Economic prosperity
2. Literacy levels
3. Scientific development

This lack of empirical support, but it is important because **every country has to have minimal economic/technological capacity**. Necessary but insufficient condition.

# How to measure Technological Determinants

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## 1. Gross domestic product per capita

This reflects level of **economic development** which is linked to **sophisticated technical, engineering, and manufacturing knowledge necessary for the development and nuclear arms.**

## 2. Industrial capacity index

## 3. Energy, electricity, and steel production and consumption

# External Determinants

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Focus on 2 factors

1. Presence (or absence) of a security threat
2. Security guarantee from a powerful alliance partner

Many realists emphasize the threat environment for pursuing nuclear arms, but **there are selection bias** in their research and **countries have at least three potential choice for security threat**. Also under multipolarity, **security guarantees are withdrawn or less credible**.



# How to measure External Determinants

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## 1. Enduring rivalry

Dichotomous variable indicating **whether a state was involved in one or more enduring rivalries in a given**

## 2. Frequency of dispute involvement

**Calculate the 5-year moving average of the number of militarized interstates per year**

## 3. Security guarantee

United States, Soviet Union/Russia, United Kingdom, France, and China is counted as nuclear-capable, great power allies

**Count defense pacts as providing a significant security guarantee**

# Domestic Determinants

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## Focus on 4 factors

### 1. Democracy

“Core” states constitutes liberal democracies with shared norms and values which foster international cooperation with “periphery” states; there is exception

### 2. Liberalizing governments

Economic component of domestic liberalization in reducing the appeal of nuclear weapons.

### 3. Autonomous domestic elite

Degree of autonomy afforded the domestic elite in choosing to pursue nuclear arms

### 4. Symbolic/status motivation

State's behavior is determined by shared beliefs and norms in international relations

# How to measure Domestic Determinants

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## 1. Democracy and democratization

Measurement of the level of democracy within each state by combining the two separate 11-point scales for democracy and autocracy from Polity IV:

$$\text{dem}_i = \text{democ}_i - \text{auto}_i$$

## 2. Economic interdependence and liberalization

- exports plus imports as a share of GDP as a measure of exposure to the international economy
- calculating the change in trade ratios over spans of 3, 5, and 10 years to measure of trade liberalization.

## 3. Status inconsistency/symbolic motivations

Compare each country with the United States and with each state's leading regional power

# Methods

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## Event history model and multinomial logistic regression

- Method that is both well suited to rare events and able to model the effects of time ; that accounts for “right censoring” and avoids the selection bias ; that allows to include explanatory variables that change in value over the observation period

This model provide estimates of the probability of a state going nuclear or starting down that path at a particular time

$$h(t|x_j) = pt^{p-1} \exp (\beta_0 + x_j B_x),$$

# Result

TABLE 2  
The Correlates of Nuclear Weapons Proliferation

| Independent Variable             | Dependent Variable                             |  |  |
|----------------------------------|--|--|--|
|                                  | Explore  | Pursue   | Acquire  |
| Technological determinants       |  |  |  |
| GDP per capita                   | 0.00052 <sup>.119</sup><br>(0.0003)            | <b>0.001</b> <sup>.017</sup><br>(0.0004)       | 0.0002 <sup>.378</sup><br>(0.0003)             |
| GDP squared                      | <b>-3.66e-08</b> <sup>.094</sup><br>(2.19e-08) | <b>-7.92e-08</b> <sup>.017</sup><br>(3.11e-08) | <b>-2.36e-08</b> <sup>.100</sup><br>(1.43e-08) |
| Industrial capacity index        | <b>1.89</b> <sup>.016</sup><br>(0.78)          | <b>1.46</b> <sup>.046</sup><br>(0.73)          | <b>3.19</b> <sup>&lt;.001</sup><br>(0.91)      |
| External determinants            |  |  |  |
| Enduring rivalry                 | <b>1.57</b> <sup>.002</sup><br>(0.50)          | <b>1.83</b> <sup>.024</sup><br>(0.81)          | <b>2.13</b> <sup>.076</sup><br>(1.77)          |
| Dispute involvement              | <b>0.17</b> <sup>.010</sup><br>(0.07)          | <b>0.38</b> <sup>&lt;.001</sup><br>(0.09)      | <b>0.23</b> <sup>.070</sup><br>(0.13)          |
| Alliance                         | -0.67 <sup>.260</sup><br>(0.59)                | -0.83 <sup>.194</sup><br>(0.64)                | -1.01 <sup>.225</sup><br>(0.83)                |
| Internal determinants            |  |  |  |
| Democracy                        | 0.02 <sup>.525</sup><br>(0.038)                | <b>0.070</b> <sup>.084</sup><br>(0.038)        | 0.092 <sup>.123</sup><br>(0.059)               |
| Democratization                  | -0.03 <sup>.578</sup><br>(0.056)               | -0.080 <sup>.323</sup><br>(0.081)              | 0.016 <sup>.895</sup><br>(0.120)               |
| Percentage of democracies        | -0.05 <sup>.204</sup><br>(0.04)                | <b>-0.186</b> <sup>.007</sup><br>(0.069)       | -0.094 <sup>.351</sup><br>(0.101)              |
| Economic openness                | -0.01 <sup>.235</sup><br>(0.01)                | -0.018 <sup>.112</sup><br>(0.012)              | 0.0002 <sup>.989</sup><br>(0.015)              |
| Economic liberalization          | <b>-0.037</b> <sup>.030</sup><br>(0.017)       | <b>0.35</b> <sup>.010</sup><br>(0.014)         | -0.001 <sup>.963</sup><br>(0.018) <sup>†</sup> |
| Constant                         | <b>-4.66</b> <sup>&lt;.001</sup><br>(1.32)     | <b>-6.34</b> <sup>.016</sup><br>(2.63)         | -7.52 <sup>.022</sup><br>(3.29)                |
| Ancillary parameter ( <i>p</i> ) | 0.55   | 1.42   | 1.04   |
| Standard error ( <i>p</i> )      | 0.113  | 0.48   | 0.36   |
| Log likelihood                   | -56.12   | -28.57   | -19.61   |
| Number of countries              | 149  | 149  | 149  |
| Total observations               | 5,215  | 5,578  | 5,784  |

NOTE: Coefficients are estimates for parametric survival models with a Weibull distribution; robust standard errors, adjusted for clustering by country, are in parentheses. *p* values are superscripted and are for two-sided tests. Coefficients that are significant at better than the 10% level are bold. GDP = gross domestic product.

TABLE 3  
Substantive Effects of the Explanatory Variables  
on the Likelihood of Exploring Nuclear Weapons

| <i>Variable</i>                                    | <i>Percentage Change from<br/>Baseline Hazard Rate</i> |                |
|--|--|----------------|
|  | <i>Explore</i>   | <i>Acquire</i> |
| Great-power military alliance                      | -49  | -64            |
| Participation in ongoing enduring rivalry          | +382   | +743           |
| Increase in frequency of MIDs (two more/year)      | +38  | +52            |
| Industrial capacity threshold                      | +563   | +2,340         |
| Increase in trade openness                         | -72  | -2             |
| Increase in per capita GDP—\$500 at very low level | +26  | +12            |
| Increase in per capita GDP—\$500 at high level     | -20  | -17            |
| Satisfaction                                       | +40  | -82            |
| Increase in democracy                              | +25  | +94            |

NOTE: MID = militarized interstate dispute; GDP = gross domestic product.

TABLE 4  
Pathways to Proliferation: Multinomial Logit Models

| Independent Variable      | Level  |  |  |
|---------------------------|--|--|--|
|                           | 1 (Explore)  | 2 (Pursue)   | 3 (Acquire)  |
| Technological determinism |  |  |  |
| GDP per capita            | <b>0.0003</b> <sup>&lt;.001</sup><br>(0.00005)     | <b>0.0005</b> <sup>&lt;.001</sup><br>(0.0001)      | <b>0.0004</b> <sup>&lt;.001</sup><br>(0.0001)      |
| GDP squared               | <b>-1.55e-08</b> <sup>&lt;.001</sup><br>(2.73e-09) | <b>-4.36e-08</b> <sup>&lt;.001</sup><br>(7.86e-09) | <b>-1.00e-08</b> <sup>&lt;.001</sup><br>(1.80e-09) |
| Industrial capacity index | <b>2.88</b> <sup>&lt;.001</sup><br>(0.270)         | <b>2.41</b> <sup>&lt;.001</sup><br>(0.280)         | <b>22.59</b> <sup>&lt;.001</sup><br>(0.664)        |
| External determinants     |  |  |  |
| Enduring rivalry          | <b>0.43</b> <sup>.017</sup><br>(0.179)             | <b>0.67</b> <sup>.003</sup><br>(0.221)             | <b>1.61</b> <sup>&lt;.001</sup><br>(0.240)         |
| Dispute involvement       | <b>0.31</b> <sup>.002</sup><br>(0.099)             | <b>0.77</b> <sup>&lt;.001</sup><br>(0.105)         | <b>0.86</b> <sup>&lt;.001</sup><br>(0.119)         |
| Alliance                  | <b>-1.24</b> <sup>&lt;.001</sup><br>(0.19)         | <b>-0.22</b> <sup>.205</sup><br>(0.18)             | <b>-1.25</b> <sup>&lt;.001</sup><br>(0.18)         |
| Internal determinants     |  |  |  |
| Democracy                 | <b>0.020</b> <sup>.073</sup><br>(0.011)            | <b>-0.027</b> <sup>.055</sup><br>(0.014)           | <b>0.029</b> <sup>.018</sup><br>(0.012)            |
| Democratization           | <b>-0.005</b> <sup>.790</sup><br>(0.020)           | <b>0.003</b> <sup>.937</sup><br>(0.032)            | <b>-0.023</b> <sup>.334</sup><br>(0.024)           |
| Percentage of democracies | <b>-0.122</b> <sup>&lt;.001</sup><br>(0.017)       | <b>0.017</b> <sup>.390</sup><br>(0.019)            | <b>0.036</b> <sup>.066</sup><br>(0.019)            |
| Economic openness         | <b>-0.028</b> <sup>&lt;.001</sup><br>(0.003)       | <b>-0.012</b> <sup>.001</sup><br>(0.003)           | <b>-0.027</b> <sup>&lt;.001</sup><br>(0.003)       |
| Economic liberalization   | <b>0.002</b> <sup>.917</sup><br>(0.009)            | <b>-0.007</b> <sup>.299</sup><br>(0.007)           | <b>0.003</b> <sup>.675</sup><br>(0.007)            |
| Constant                  | <b>-1.47</b> <sup>.006</sup><br>(0.538)            | <b>-6.95</b> <sup>&lt;.001</sup><br>(0.745)        | <b>-28.31</b> <sup>&lt;.001</sup><br>(0.339)       |

NOTE: Log pseudo-likelihood = -1874; pseudo- $R^2$  = 0.39; total observations = 6,125. The reference category is no steps to pursue nuclear weapons. Coefficients are estimates for multinomial logit regression models, with robust standard errors in parentheses. *p* values are superscripted and are for two-sided tests. Coefficients that are significant at better than the 10% level are in bold. GDP = gross domestic product.

# Puzzling Misses

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TABLE 5  
Dogs That Didn't Bark? Countries That Did Not Seriously  
Explore the Nuclear Option . . . but Should Have

| <i>Country</i> | <i>Years of Maximum Predicted Hazard</i> |
|----------------|--|
| Saudi Arabia   | Mid-1980s to mid-1990s                   |
| West Germany   | Mid-1950s to early 1960s                 |
| Japan          | Mid-1950s to 1960s                       |
| Turkey         | Late 1960s to 2000                       |
| Bulgaria       | 1950s                                    |
| Spain          | 1960s to early 1970s                     |
| Greece         | 1960s and 1980s                          |
| Italy          | 1950s to early 1960s                     |
| Syria          | Various                                  |



# Conclusion

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- According to the new data set on nuclear weapons proliferation, nuclear weapons proliferation is reasonably well accounted for by **the level of economic development and the external threat environment**
- Therefore, by reducing the threat posed by its external environment , accelerating economic growth, encouraging integration into the world economy and encouraging a defensive alliance with a great power will reduce country's temptation to pursue nuclear arms.