# Quantitative Analysis of the Civilian Bilateral Cooperation in Front-End of the Nuclear Fuel Cycle

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## 1. Introduction

As part of the academic endeavour in analysing the proliferation risks of nuclear power, bilateral civilian nuclear cooperation has been studied through both qualitative and quantitative analysis in order to establish the implications of such cooperation on nuclear proliferation. A substantial part of such cooperation is related to the front-end of the nuclear fuel cycle, which encompasses the processes that help manufacturing nuclear fuel, including mining and milling of natural uranium, refining and chemical conversion, enrichment (in case of fuels for Pressurized Water Reactor – PWR), and fuel fabrication. Traditionally, the supply of natural uranium was dominated by Canada and Australia, whereas enrichment services have been mostly provided by companies from Western states or Russia, which are also the main customers of such services [1]. However, Kazakhstan and African countries like Niger, Namibia, and Malawi have emerged as important suppliers in the international uranium market [2] and recent forecasts show that China will soon become a major player in the front-end market as both consumer and service provider. In this paper, the correlation between bilateral civil nuclear cooperation in front-end of the nuclear fuel cycle and the political and economic relationship among countries was examined through a dataset of bilateral nuclear cooperation in the post-Cold War era, from 1990 to 2011. This period was selected based on the observation that the geo-political landscape, as well as the conditions for civilian nuclear cooperation, have changed drastically after the end of the Cold War.

## 2. Methods and Results

In this section, the development of the dependent and independent variables in the bilateral nuclear cooperation dataset is presented. The correlations between those attributes are examined using linear regression analysis and the findings are discussed with respect to their implications to nuclear nonproliferation and export control regimes.

#### 2.1 Dependent variable

A dichotomy variable named *nuccop* was selected to represent the civilian nuclear cooperation between two countries. This variable has value "1" if, since 1990, there have existed exporting activities related to frontend from an exporter to an importer, including material export of natural or enriched uranium, export of frontend services like conversion or enrichment, or financial export in form or partnership or ownership in front-end projects. The variable was coded "0" otherwise. To get a comprehensive view of the front-end bilateral cooperation worldwide, 100 states were chosen in this study due to their existing or potential involvement in front-end activities, of which 65 were solely "importer" whereas the other 35 were considered as both "exporter" and "importer" taking into account their front-end capabilities and potentials. As such, 3465 dyads (pair of countries) were formed with one nuccop value assigned to each dyad based upon the literature review of academic papers and other information sources such as the International Atomic Energy Agency (IAEA), the World Nuclear Association (WNA), or the Nuclear Threat Initiative (NTI).

### 2.2 Independent variables

The independent variables were selected to reflect the bilateral relationship between countries in both political and economic aspects. These variables were developed based on the publicly available databases of: the International Monetary Fund (IMF); the World Trade Organisation (WTO); the Nuclear Energy Agency (NEA); the United Nations Conference on Trade and Development (UNCTAD); the Stockholm International Peace Research Institute (SIPRI); and the projects Correlates of War (COW), Polity IV, and Rivalry dataset [3]. Since the existence of a nuclear cooperation agreement (NCA) is often the prerequisite condition for civilian nuclear trade [4] and the geographical proximity would likely facilitate such transaction, these two were considered as control variables of this analysis. Brief description of these variables is presented in Table 1.

Table 1: Description of the independent variables utilized to describe the relationship between two states

No	Variable and description	Reference	
Variables related to political aspect			
01	<i>polidiff</i> : Similarity in term of democracy level, reflected	Polity IV Project	
	through the Polity IV score	U	
02	<i>affinity</i> : Similarity in the voting results at the United Nations General Assembly	COW	

02	-llimon Existence of a military	COW
03	alliance: Existence of a military	COW
	alliance between two country	
0.4	since 1990	COW
04	midbdiff: Similarity in term of	COW
	level of involvement in	
0.5	militarized interstate dispute	D: 1
05	rival1990: Existence of rivalry	Rivalry
	between two countries since 1990	dataset
06	igo: Similarity in term of	COW
	participation in international	
	governmental organizations	
07	ce1990: Existence of common	Rivalry
	enemy between two countries	dataset
	since 1990	
Variables related to economic aspect		
01	bitrade: Bilateral trade between	IMF
	two countries	
02	fdi: Foreign direct investment	UNCTAD
	from the nuclear exporter to its	
	importer	
03	armtrade: Existence of	SIPRI
	conventional weapon transactions	
	from the nuclear exporter to its	
	importer	
04	GDP1/GDP2: Ratio of GDP	WTO
	between the nuclear exporter and	
	its importer	
05	cinc: Similarity in term of	COW
	industrial capabilities of two	
	countries, reflected through the	
	Composite Index of National	
	Capability (CINC)	
06	<i>u_diff</i> : Difference in term of	NEA
	annual net uranium production	
	capabilities (annual production	
	minus requirement) between two	
	countries	
Control variables		
01	proximity: Geographical	COW
	proximity between countries	
02	nca1990: Existence of a nuclear	NCA
	cooperation agreement between	dataset
	two countries since 1990	<u> </u>

### 2.3 Regression results

Possible correlations between the dependent variable *nuccop* and the above-mentioned independent attributes were investigated through simple linear regression analysis using the method proposed by Nelson and Sprecher (2010) [5]. The regression results show that there is a statistically significant correlation between the existence of bilateral cooperation in front-end of the nuclear fuel cycle and all the independent variables except for the politics-related variables *polidiff, midbdiff, igo*, and *ce1990*. Among those statistically significant attributes, the economics-related factors have more important influence on the dependent variable *nuccop*, of which the difference in term of net uranium production capabilities *u\_diff* has the strongest effect, followed by

the bilateral trade *bitrade*, and the foreign direct investment *fdi*. As predicted, the control variables *proximity* and *nca1990* also strongly correlate with the dependent variable *nuccop*. The resulted coefficients of the statistically significant variables from the regression analysis are presented in Figure 1.

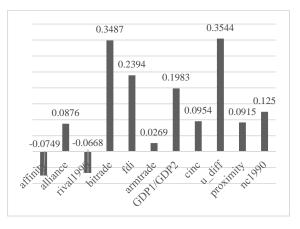


Fig. 1. Correlation coefficients of the statistically significant independent variables with the dependent variable *nuccop* resulted from the regression analysis.

#### 2.4 Discussions

From the regression results, it can be observed that the commercial factors have significant contribution to the existence of bilateral cooperation related to front-end of the nuclear fuel cycle. This quantitative finding complements the traditional view on civilian nuclear cooperation, in which strategic and geo-political factors are more important in enabling nuclear assistance [4][6], and is in accordance with a recent qualitative assessment by Lantis (2014) regarding this aspect [7]. As uranium and front-end capabilities like enrichment are essential to both nuclear power development and possible proliferation intent, the research on forecasting and preventing nuclear proliferation should take into account such implication of the economics-related factors.

Using the above-mentioned coefficients to calculate the potential of the exporting countries in creating new tie with the importing countries, it was found that China and Kazakhstan have significant potential in expanding their front-end exportation. Given this situation, the export regimes, especially the Nuclear Suppliers Group (NSG), needs to be reviewed and strengthened, since China and Kazakhstan are relatively new NSG members with lesser experiences in nuclear export control.

#### 3. Conclusions

To study the socio-economic nature of the bilateral cooperation related to front-end of the nuclear fuel cycle, a new dataset was developed including both political and economic aspects of such cooperation. Using linear regression analysis, a strong correlation between the existence of bilateral front-end cooperation and the commercial attributes was observed. Such finding has implication on not only the nonproliferation research but also the necessary reinforcement of export control regimes like such as the Nuclear Suppliers Group. Further improvement of this dataset and the regression method are also needed in order to increase the robustness of the findings as well as to cover the whole scope of the nuclear fuel cycle, including both front-end and back-end activities.

## REFERENCES

[1] G. Rothwell, Market Power in Uranium Enrichment, Science & Global Security: The Technical Basis for Arms Control, Disarmament, and Nonproliferation Initiatives, 17:2-3, 132-154, 2009.

[2] OECD/NEA & IAEA, Uranium 2014: Resources, Production and Demand, Organisation for Economic Co-Operation and Development, 2014.

[3] J. P. Klein & G. Goertz, The New Rivalry Dataset: Procedures and Patterns, Journal of Peace Research, Vol. 43, No. 3, 2006.

[4] M. Fuhrmann, Taking a Walk on the Supply Side: The Determinants of Civilian Nuclear Cooperation, Journal of Conflict Resolution, Vol. 53, No. 2, 2009.

[5] P. Nelson & C. M. Sprecher, Are sensitive technologies enablers of civil nuclear power? An empirical study, Atoms for Peace – An International Journal, Vol. 3, No. 2, 2010.

[6] M. Kroenig, Exporting the Bomb: Why States Provide Sensitive Nuclear Assistance, American Political Science Review, Vol. 103, No. 1, 2009.

[7] J. Lantis, Economic Competition and Nuclear Cooperation, The Nonproliferation Review, Vol. 21, No. 1, 2014.