

# “Trade Integration, Market Size, and Industrialization”

## Discussion of Faber, ReStud 2014

Nathan Schiff  
Shanghai University of Finance and Economics

Graduate Urban Economics, Lecture 6  
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# Administration

Homework due today

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1. What happens to population of small city?
2. How are neighboring, unconnected cities affected?

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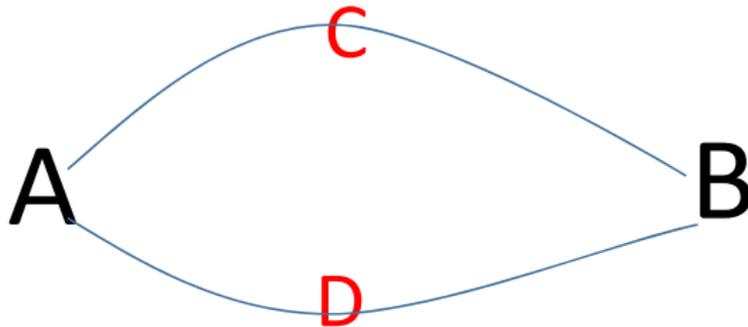
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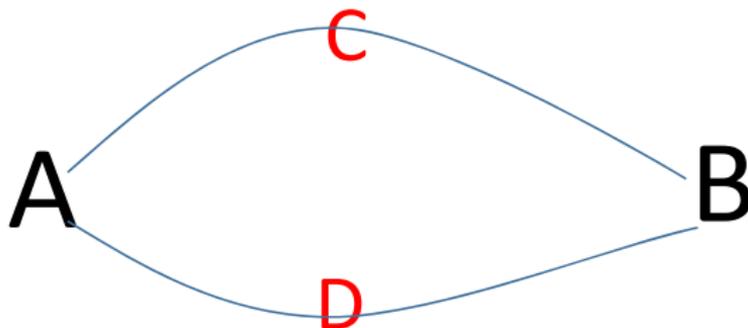
General importance of China as a large country

# Basic Setup



New road policy is to connect large cities A and B

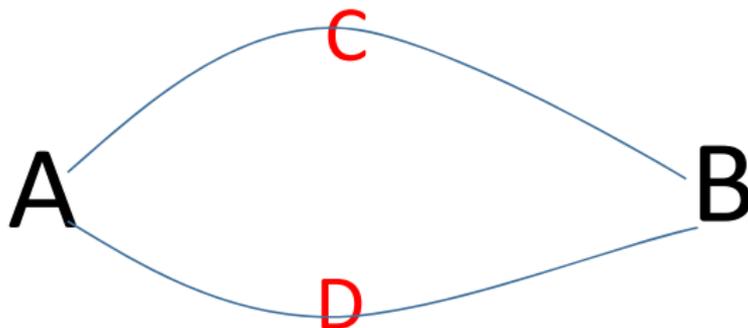
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What is effect on peripheral economy of new road?

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Note: no official list of targeted cities, Faber uses stated aim to classify these

# National Trunk Highway System map



FIGURE 1

China's National Trunk Highway System. The figure shows Chinese county boundaries in 1999 in combination with the targeted city nodes and the completed expressway routes of the NTHS in the year 2007.

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1. Least cost path spanning network: minimize total network cost given cost of building along different land cover types (slope/elevation, developed land, wetland, water)
2. Euclidean path network: minimize total network cost using straight line connections

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Online appendix: discusses testing for whether land cover features could be endogenous (also includes as controls)

Additional discussion of LATE vs population average: argues should be no difference here

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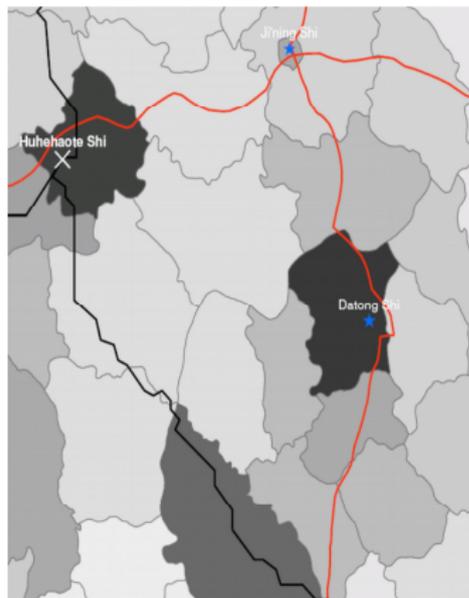
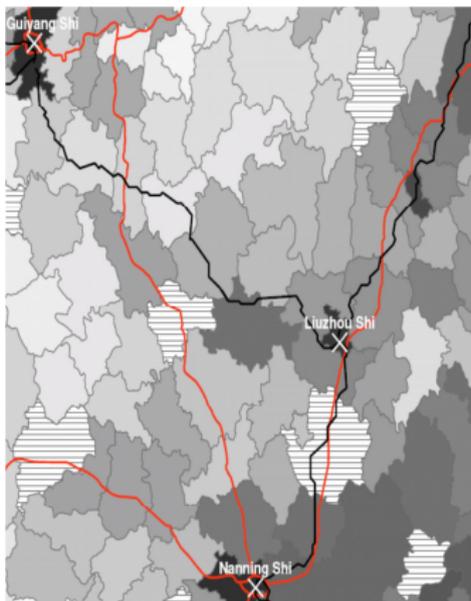
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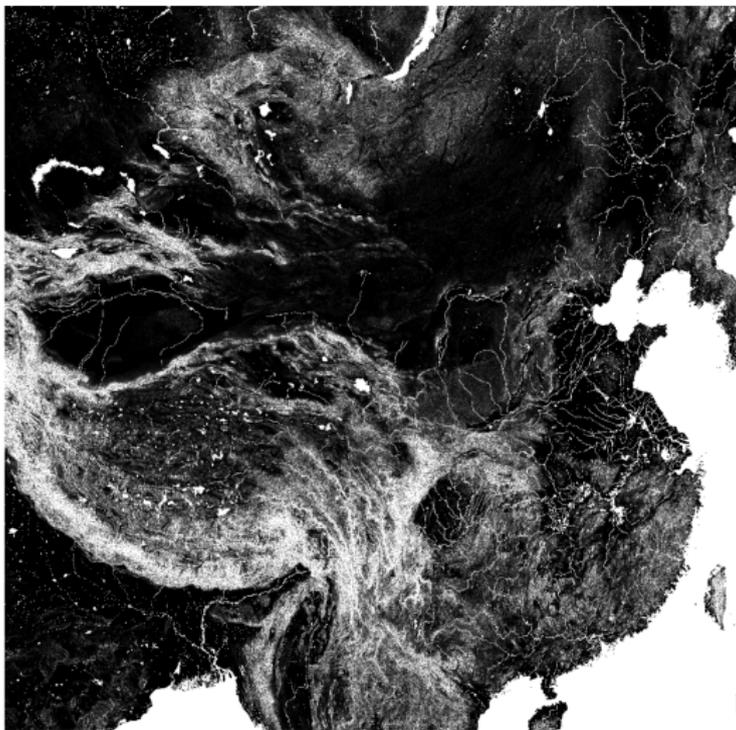
- Uses US and Chinese government data on characteristics of land parcels (GIS raster data is basically a grid of cells with values)
- Uses ArcGIS to run algorithms that minimize construction cost of entire road network based on requirement of connecting 54 cities and given costs of land types
- Output of process is a network of bi-lateral curves between 54 cities

# Least Cost Path Spanning IV Example



The network in red color depicts actual NTHS expressway routes. The network in black color depicts the least cost path spanning tree network. Crosses indicate targeted metropolitan nodes. Counties are color coded according to their nominal levels of GDP in 1997, where darker colors represent higher values. Striped areas indicate missing 1997 GDP data.

# Construction Cost Map



The figure depicts the construction cost raster used as input into the least cost path algorithm. The color scale ranges from white (very high cost of crossing a parcel of land) to black (very low cost of crossing a square km parcel of land). The cost assignment is based on land gradient (slope) as well as land cover (water, wetlands, and developed land), and described in more detail in the text.

# Least Cost Path Spanning IV Map

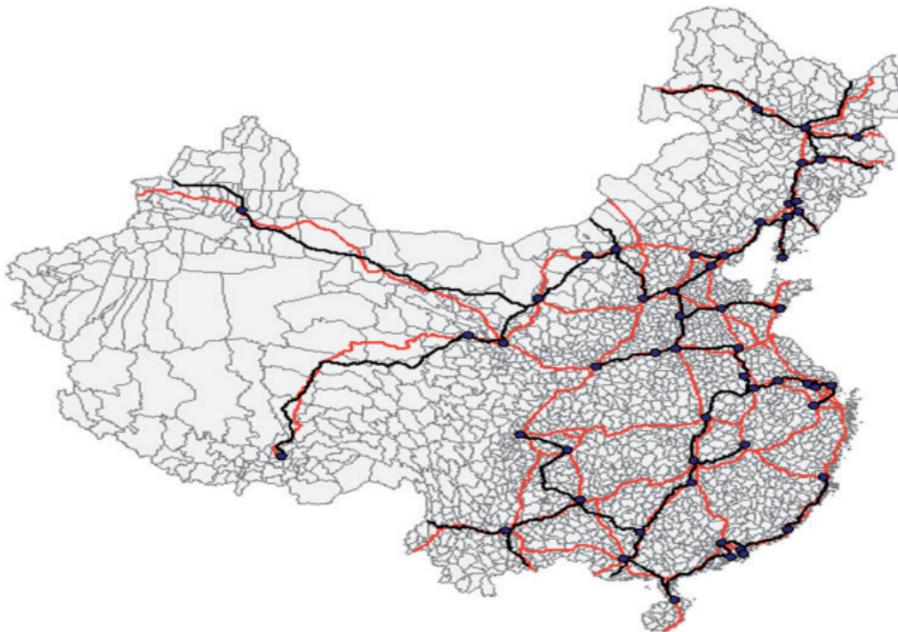


FIGURE 2

Least cost path spanning tree network. The network in red colour depicts the completed NTHS network in 2007.

The network in black colour depicts the least cost path spanning tree network. The black routes are the result of a combination of least cost path and minimum spanning tree algorithms. In the first step Dijkstra's (1959) optimal route algorithm is applied to land cover and elevation data in order to construct least costly paths between each bilateral pair of the targeted destination. In the second step, these bilateral cost parameters are fed into Kruskal's (1956) minimum spanning tree algorithm. This algorithm identifies the subset of routes that connect all targeted nodes on a single continuous network subject to global construction cost minimization.

# Euclidean IV

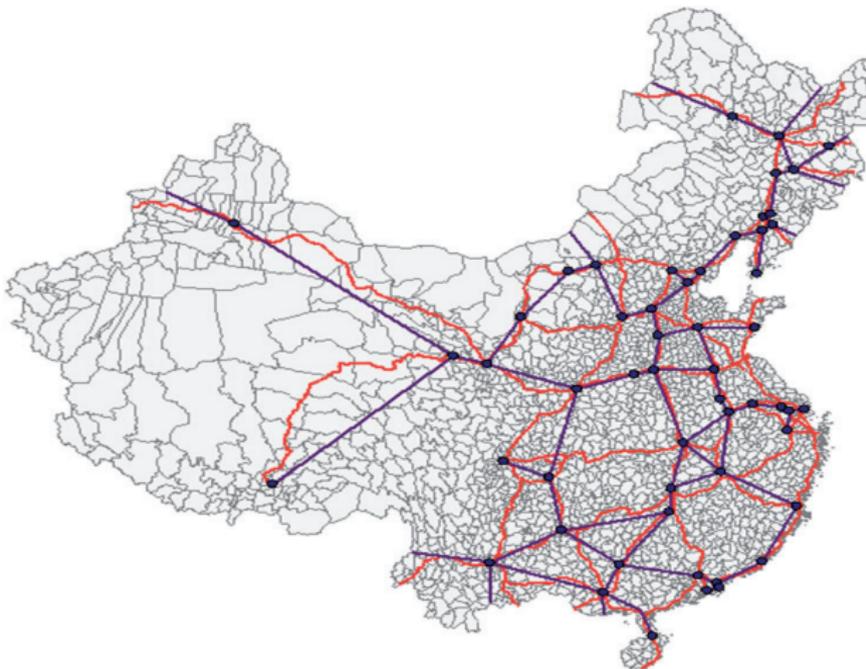


FIGURE 3

Euclidean spanning tree network. The network in red colour depicts the completed NTHS network in 2007. The network in darker colour depicts the Euclidean spanning tree network. The routes are the result of applying Kruskal's (1956) minimum spanning tree algorithm to bilateral Euclidean distances between targeted destinations. This algorithm is first run for the all-China network, and then repeated within North-Centre-South and East-Centre-West divisions of China. These regional repetitions add 9 routes to the original minimum spanning tree.

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No effect on county population growth

Table 2: First Stage

TABLE 2  
First stage regressions

Dependent variable:	(1) Connect	(2) Connect	(3) Connect	(4) lnDistHwy	(5) lnDistHwy	(6) lnDistHwy
Least cost path IV	0.323*** (0.0574)		0.254*** (0.0635)	0.317*** (0.0645)		0.245*** (0.0635)
Euclidean IV		0.243*** (0.0529)	0.144** (0.0560)		0.280*** (0.0599)	0.193*** (0.0657)
lnDistNode	-0.130*** (0.0376)	-0.127*** (0.0295)	-0.104*** (0.0323)	0.588*** (0.130)	0.635*** (0.112)	0.426*** (0.122)
Prefect capital	-0.124* (0.0648)	-0.129* (0.0736)	-0.120* (0.0658)	0.437** (0.209)	0.429* (0.229)	0.413* (0.215)
City Status	0.0891** (0.0403)	0.0929** (0.0437)	0.0847** (0.0399)	-0.297*** (0.0946)	-0.296*** (0.103)	-0.270*** (0.0951)
lnUrbPop90	0.106*** (0.0225)	0.115*** (0.0217)	0.107*** (0.0209)	-0.228*** (0.0691)	-0.244*** (0.0640)	-0.227*** (0.0636)
Educ90	-0.273 (0.598)	-0.303 (0.656)	-0.302 (0.601)	-1.671 (1.697)	-1.747 (1.804)	-1.626 (1.666)
AgShare90	-0.170 (0.182)	-0.216 (0.189)	-0.167 (0.179)	0.0238 (0.537)	-0.00173 (0.555)	-0.0160 (0.533)
Obs	1342	1342	1342	1342	1342	1342
R <sup>2</sup>	0.222	0.204	0.233	0.401	0.394	0.414
First stage F-Stat	31.61	21.07	20.31	24.09	21.82	15

*Notes:* All regressions include province fixed effects. Columns 1–3 report results for binary NTHS connection indicators among peripheral counties. Columns 4–6 report results for the log distance to the nearest NTHS segment among peripheral counties. lnDistNode is log county distance to the nearest targeted city node. Prefect Capital and City Status are binary indicators for respective county status in 1990. lnUrbPop90 is log 1990 county urban population. Educ90 is the 1990 county share of above compulsory schooling in 20+ population. AgShare90 is the 1990 county share of agricultural employment. Standard errors are clustered at the province level and stated in parentheses below point estimates. \*\*\*1%, \*\*5%, and \*10% significance levels.

# Table 3: Main Specification

TABLE 3  
Network connection effects among peripheral counties

Dependent variables		(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)
		OLS No controls	OLS With controls	LCP IV No controls	LCP IV With controls	Euclid IV No controls	Euclid IV With controls	Both IVs No controls	Both IVs With controls	Both IVs With controls
Change ln(IndGVA) 1997–2006	Connect	−0.0529 (0.0418)	−0.0356 (0.0499)	−0.284** (0.118)	−0.304** (0.145)	−0.246* (0.148)	−0.287* (0.154)	−0.272*** (0.0965)	−0.297*** (0.108)	−0.297** (0.121)
	Obs	1302	1280	1302	1280	1302	1280	1302	1280	1280
	R <sup>2</sup>	0.242	0.255							
Change ln(NonAgGVA) 1997–2006	Connect	−0.0411 (0.0335)	−0.0266 (0.0375)	−0.243** (0.0983)	−0.252** (0.117)	−0.270** (0.122)	−0.296** (0.131)	−0.251*** (0.0877)	−0.268*** (0.0969)	−0.268*** (0.0946)
	Obs	1285	1262	1285	1262	1285	1262	1285	1262	1262
	R <sup>2</sup>	0.27	0.284							
Change ln(GovRevenue) 1997–2006	Connect	−0.0497* (0.0285)	−0.0914*** (0.0295)	−0.0542 (0.109)	−0.223* (0.120)	−0.175 (0.117)	−0.315** (0.132)	−0.0926 (0.0893)	−0.257*** (0.0996)	−0.257*** (0.100)
	Obs	1290	1285	1290	1285	1290	1285	1290	1285	1285
	R <sup>2</sup>	0.275	0.334							
Change ln(GDP) 1997–2006	Connect	−0.00204 (0.0245)	−0.0144 (0.0276)	−0.106 (0.0830)	−0.177* (0.0942)	−0.178 (0.112)	−0.254** (0.116)	−0.127 (0.0824)	−0.203** (0.0886)	−0.203** (0.080)
	Obs	1297	1272	1297	1272	1297	1272	1297	1272	1272
	R <sup>2</sup>	0.228	0.264							
Change ln(AgGVA) 1997–2006	Connect	−0.00344 (0.0210)	−0.00790 (0.0220)	0.000194 (0.0631)	−0.0252 (0.0789)	−0.0305 (0.0672)	−0.0597 (0.0728)	−0.00865 (0.0545)	−0.0371 (0.0630)	−0.0371 (0.0654)
	Obs	1335	1313	1335	1313	1335	1313	1335	1313	1313
	R <sup>2</sup>	0.202	0.208							
Change ln(Population) 1997–2006	Connect	0.00488 (0.00456)	−0.00217 (0.00568)	0.0395** (0.0188)	0.0264 (0.0234)	0.0183 (0.0242)	0.0104 (0.0262)	0.0333* (0.0183)	0.0207 (0.0215)	0.0207 (0.0225)
	Obs	1337	1314	1337	1314	1337	1314	1337	1314	1314
	R <sup>2</sup>	0.234	0.271							

# Table 4: Falsification Test

TABLE 4  
Falsification test before and after the network was built

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
Dependent variable:	OLS	OLS	LCP IV	LCP IV	Euclid IV	Euclid IV	Both IVs	Both IVs
Change ln(LocGovRev)	1990-97	1997-06	1990-97	1997-06	1990-97	1997-06	1990-97	1997-06
<i>Panel A: Binary</i>								
Connect	0.0154 (0.0410)	-0.0848** (0.0360)	0.0143 (0.0853)	-0.151 (0.0974)	0.117 (0.107)	-0.282** (0.129)	0.0563 (0.0647)	-0.204*** (0.0467)
Obs	894	894	894	894	894	894	894	894
R <sup>2</sup>	0.274	0.339						
First stage F-Stat			19.635	19.635	19.091	19.091	14.93	14.93
<i>Panel B: log Distance</i>								
ln(DistHwy)	-0.0114 (0.0142)	0.0160 (0.0190)	-0.0409 (0.0350)	0.0854* (0.0470)	-0.00442 (0.0573)	0.185** (0.0783)	-0.0274 (0.0329)	0.122*** (0.0430)
Obs	894	894	894	894	894	894	894	894
R <sup>2</sup>	0.275	0.336						
First stage F-Stat			18.696	18.696	17.306	17.306	11.259	11.259

Notes: Each point estimate stems from a separate regression. All regressions include province fixed effects and a full set of county controls. LCP IV stands for the least cost path spanning tree instrument. Euclid IV stands for the straight line spanning tree instrument. Panel A presents results for binary NTHS connection indicators (for both OLS and instruments) and Panel B presents results for log distance to the nearest NTHS segment (again for both OLS and instruments). Standard errors are clustered at the province level and stated in parentheses below point estimates. \*\*\*1%, \*\*5%, and \*10% significance levels.

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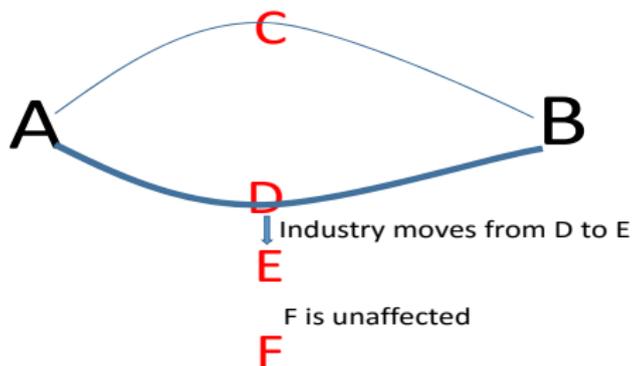
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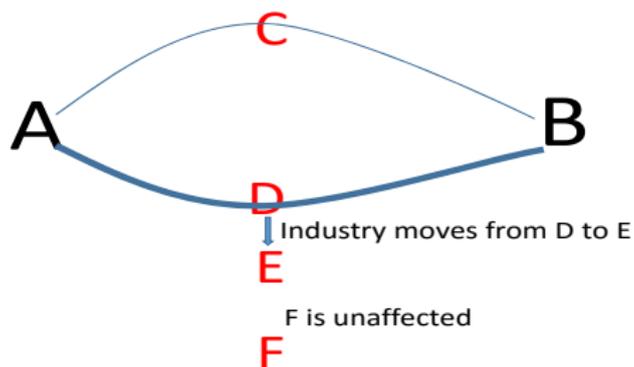
Also implies population growth should differ in connected counties compared to nearby unconnected (but how exactly? not a good fit for monocentric city model)

## Effect of Distance to NTHS Road



Decentralization implies non-monotonic effect of distance to road on output

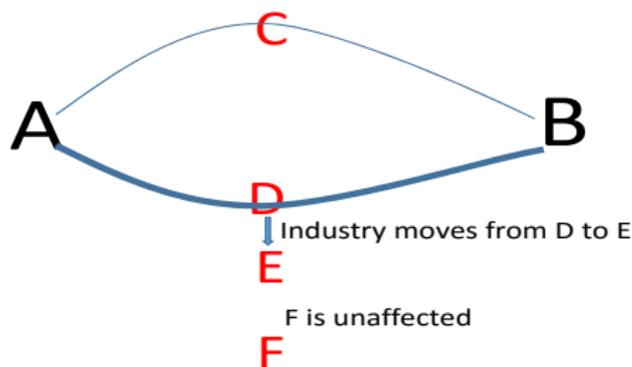
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To test this estimates effect of distance using high-order polynomial (effect can vary greatly with distance)

# Fitted Effect of Distance

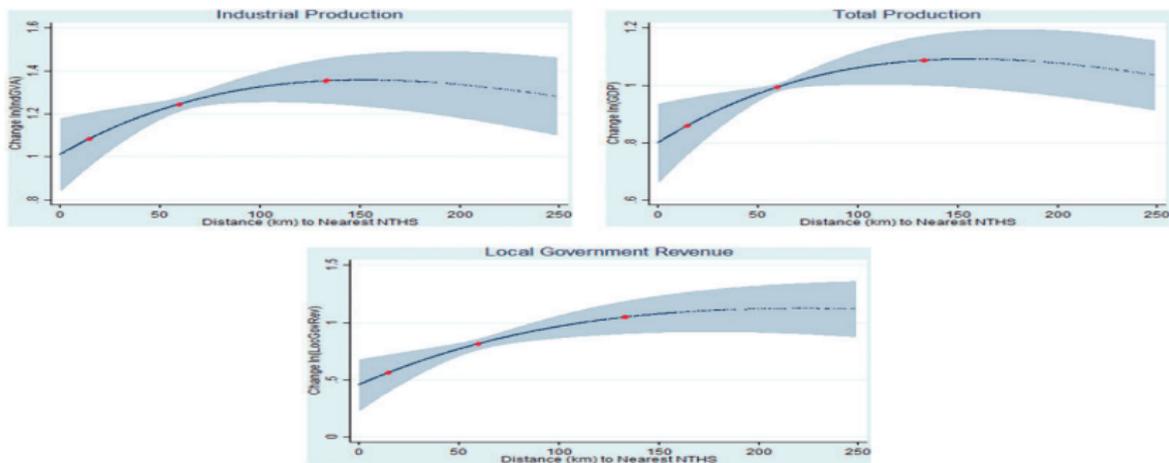


FIGURE 4

Estimated effect of peripheral connections over distance to the nearest NTHS route. The graphs depict the flexibly estimated relationships between distance to the nearest NTHS route and peripheral county growth in industrial value added, total GDP, and local government revenue. The plots correspond to the best fitting polynomial functional form according to the Akaike Information Criterion (AIC). The functions and confidence intervals are based on IV estimates holding covariates at their mean. County distance to the NTHS and its polynomial terms are instrumented with distances to the LCP and Euclidean spanning trees and their polynomials. The red dots indicate median county distances to the nearest NTHS route among connected peripheral counties (left), peripheral counties neighbouring a connected county (centre), and the remaining peripheral counties farther away (right). The shaded areas indicate 90% confidence intervals. Standard errors are clustered at the province level.

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