# Tickets to the Global Market: First US Patent Awards and Chinese Firm Exports

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### Patent Globalization

▶ Global patent activity has increased steadily in recent decades

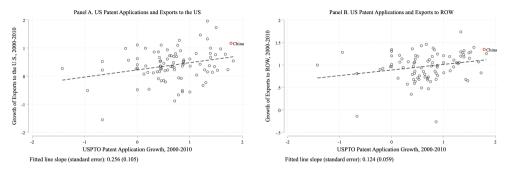
- Remarkable rise in # patents taken out by foreign firms, especially from emerging economies, in a select few patent jurisdictions
- Example: share of foreign applicants to United States Patent and Trademark Office (USPTO) went up from 44% in 2000 to 51% in 2015

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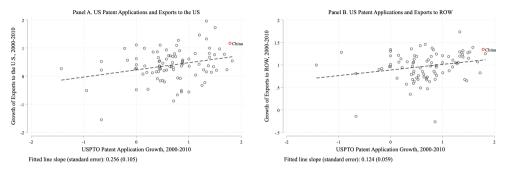
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- Example: share of foreign applicants to United States Patent and Trademark Office (USPTO) went up from 44% in 2000 to 51% in 2015
- ► First-order questions:
  - ▶ Why do firms patent their innovations abroad?
  - Can established patent authorities in developed countries act as global hubs for alleviating challenges faced by firms from emerging economies when they participate in the global marketplace?

### USPTO Patent Applications and Exports Across Countries



*Note:* These figures plot the growth in exports respectively to the U.S. and to the rest of the world across countries against the growth in USPTO patent applications over the 2000-2010 period. The slope of the corresponding fitted line and its robust standard error are reported below each figure.

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▶ U.S. patents may confer advantages to the foreign patent holders that extent beyond market protection in the U.S.

### This Paper: U.S. Patents and Chinese Exports

- ▶ Ideal institutional context: U.S. and China
  - ▶ Both are top-3 trading economies; U.S.: advanced with strong institutions vs. China: emerging with rapid structural transformation
  - ▶ Stigma about quality of Chinese products and Chinese patent system
  - ▶ U.S. is both important market and top patent office for Chinese firms

▲ Anecdotal Evidence

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▲ Anecdotal Evidence

▶ How does first U.S. patent approval affect the export performance of Chinese firms?

- Match rich data on USPTO patent applications, Chinese customs transactions, and Chinese industrial survey
- ▶ Compare successful to unsuccessful first-time applicants
- Instrument patent approval with leniency of quasi-randomly assigned USPTO examiner (Sampat and Williams, 2019; Farre-Mensa et al., 2020)
- ▶ Identify causal effect of U.S. patent and explore possible mechanisms

- 1. Successful first USPTO application improves Chinese firms' export growth
  - $\blacktriangleright$  17.5% higher annualized export growth for successful than that unsuccessful applicants
  - ▶ Driven by survival and expansion in incumbent destination-product markets (88%)
  - ▶ Battery of specification checks: balance tests, event study, placebo, robustness

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  - Quality capacity: bigger effect on exports of differentiated products to high-income countries
  - **Contract credibility**: bigger effect on exports of high contract reliance industries to high rule-of-law countries

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  - **Contract credibility**: bigger effect on exports of high contract reliance industries to high rule-of-law countries
- 4. No Mechanisms III: financial constraints, follow-on innovation

### Contribution

- Effects of patenting on firm operations: we study how cross-border patent activity is related to firms' export performance
  - Williams (2013, 2017); Galasso and Schankerman (2015); Cockburn et al. (2016); Palangkaraya et al. (2017); Galasso and Schankerman (2018); Kline et al. (2019); Sampat and Williams (2019); Farre-Mensa et al. (2020); Rassenfosse et al. (2022)
- ▶ Firm productivity, innovation, and trade: we identify the causal effect of patenting conditional on firms' innovation prowess
  - Lileeva and Trefler (2010); Aw et al. (2011); Bustos (2011); Bøler et al. (2015); Aghion et al. (2018); Liu and Ma (2020); Maican et al. (2020); Coelli et al. (2022)
- ▶ Information asymmetry in international trade: we provide novel evidence that obtaining patent recognition from a global patent hub can signal quality capacity and contractual credibility for firms in developing countries
  - Rauch (1999, 2001); Banerjee and Duflo (2000); Casella and Rauch (2002); Rauch and Trindade (2003); Feenstra and Hanson (2004); Ahn et al. (2011); Chaney (2014); Macchiavello and Morjaria (2015); Monarch and Schmidt-Eisenlohr (2017); Steinwender (2018); Akerman et al. (2022); Rauch and Trindade (2022)

# Data

### Data Sources

▶ USPTO Patent Examination Research Dataset (PatEx, 2001-2016)

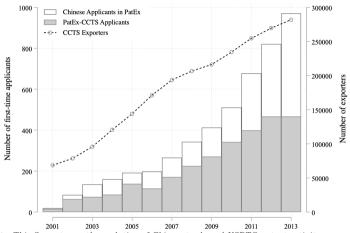
- Rich information about universe of patent applications
  - basic information about patent applicants
  - identity of patent examiners
  - outcome at each examination step
- ▶ Chinese Customs Trade Statistics (CCTS, 2000-2016)
  - universe of export and import transactions
  - ▶ transaction-level product code, country, value, quantity, etc.
- ▶ Chinese Annual Survey of Industrial Enterprises (ASIE, 1998-2013)
  - operational and financial information of above-scale industrial firms

# First-time Chinese Applicants in the USPTO

- 1. We identify Chinese applicants in PatEx based on their location information.
  - ▶ Applicant sample starts in 2001 (only approved applicants before 2001)
  - Restrict sample to incorporated applicants
  - Drop applicants from Hong Kong and Macau
  - Standardize applicants' English names
- 2. We manually match Chinese PatEx patent applicants to CCTS exporters based on name and location (from English to Chinese)
  - Cross-checks based on patent and business registration records
  - ▶ Secondary match from CCTS to ASIE standard in the literature

 $\blacktriangleright$ Illustrative Example

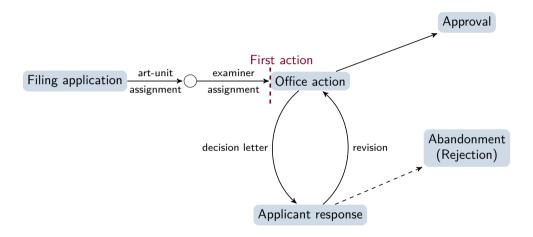
### Chinese Trade and USPTO Patent Activity Over Time



Note: This figure traces the evolution of Chinese trade and USPTO patent activity over time. The white bars display the number of Chinese firms that file a USPTO patent application for the first time in a given first-action year. The grey bars display the subset of these firms that can be matched to exporters in the CCTS-PatEx data. The dashed line displays the total number of CCTS exporters.

# **Empirical Strategy**

### The Patent Examination Process



➡ Illustrative Example

# **Empirical Setup**

We adopt the following generalized specification to estimate the effect of a successful first U.S. patent application on Chinese firms' export growth:

$$\Delta_k Export_{it+k} \equiv \frac{Export_{it+k} - Export_{it}}{0.5(Export_{it+k} + Export_{it})}$$
$$= \beta \cdot \mathbb{1}(\text{Success First App} = 1)_{iajt} + \Gamma Z_{it} + \lambda_{s\tau} + \epsilon_{it+k}$$

- ▶ i = exporter, a = art unit, j = examiner, t = first-action year,  $k \equiv 3$  in baseline
- $\blacktriangleright$  Z<sub>it</sub> controls: log initial exports, export tenure
- ▶  $\lambda_{s\tau}$ : HS2 sector by application year pair fixed effects
- ▶ Coefficient of interest:  $\beta$ 
  - OVB: patent application outcome might be correlated with unobserved firm characteristics such as inherent innovation capacity or realized innovation quality

▶ Export Growth since First-Action Year

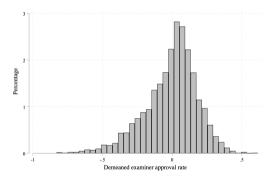
### **IV** Strategy

Identification exploits USPTO idiosyncrasy

- ▶ Patent examiners assigned quasi-randomly within technology-determined art units
- ▶ Examiners differ in their ex-ante approval propensity

 $Approval \ Rate_{iajt} = \frac{\#Granted_{iajt}}{\#Examined_{iajt}}$ 

- #Granted<sub>iajt</sub> (#Examined<sub>iajt</sub>) = patents that examiner j has granted (examined) in art unit a prior to her decision on i's application at time t
- We demean approval rates within *at* to exclude the potential bias due to non-random assignment of art unit



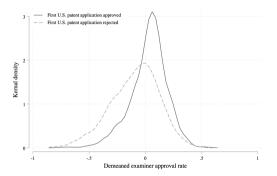
Note: This figure shows the distribution of the demeaned approval rate of USPTO patent examiners assigned to first-time patent applications by CCTS-PatEx Chinese exporters. Examiner approval rates are demeaned by art unit and firstaction year.

# First-Stage IV Validity

### We instrument $\mathbb{1}(\text{Success First App} = 1)_{iajt}$ by the demeaned Approval Rate<sub>iajt</sub>.

| Dependent variable           | Successful USPTO application |                |                |                |  |  |  |
|------------------------------|------------------------------|----------------|----------------|----------------|--|--|--|
|                              | (1)                          | (2)            | (3)            | (4)            |  |  |  |
| Examiner approval rate       | 0.970***                     | $0.968^{***}$  | 0.950***       | $0.955^{***}$  |  |  |  |
|                              | (0.0689)                     | (0.0693)       | (0.0783)       | (0.0787)       |  |  |  |
| Log exports                  |                              | 0.00227        |                | 0.0146*        |  |  |  |
|                              |                              | (0.00567)      |                | (0.00750)      |  |  |  |
| Export tenure                |                              | -0.00789*      |                | -0.00181       |  |  |  |
|                              |                              | (0.00436)      |                | (0.00508)      |  |  |  |
| Log employment               |                              |                |                | -0.0105        |  |  |  |
|                              |                              |                |                | (0.0107)       |  |  |  |
| HS2-year fixed effects       | Yes                          | Yes            |                |                |  |  |  |
| Industry-year fixed effects  |                              |                | Yes            | Yes            |  |  |  |
| Ownership-year fixed effects |                              |                | Yes            | Yes            |  |  |  |
| Sample                       | CC                           | TS             |                | ASIE           |  |  |  |
| F-test: $IV = 0$             | 198.07 * * *                 | $195.26^{***}$ | $147.05^{***}$ | $147.44^{***}$ |  |  |  |
| # Observations               | 1,156                        | 1,156          | 940            | 940            |  |  |  |

Note: This table reports first-stage regression results for the predictive power of an examiner's ex-ant demeaned approval rate for the success of an exporter's first USPTO patent application. The sample covers all CCTS-ASIE-PatEx matched exporters in Columns 1-2 and all CCTS-ASIE-PatEx matched exporters in Columns 3-4. Column 2 controls for initial log exports and export tenure. Column 4 further controls for log employment. Columns 3-4 include HS2 sector by year pair fixed effects, while Columns 3-4 include HS2 sector by year pair fixed effects, while Columns 3-4 include effects. Heroskedasticity-consistent standard errors are clustered by examiner art unit. \*\*\* p < 0.01, \*\* p < 0.01.

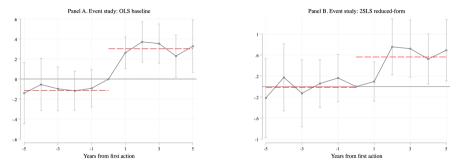


Note: This figure shows the kernel density of demeaned examiner approval rates separately for successful and unsuccessful patent applications. The sample covers all first-time USPTO applications by CCTS-PatEx Chinese exporters. Examiner approval rates are demeaned by art unit and first-action year.

#### ✤ Balance Tests → Testing for Examiner Specialization

Effect of First U.S. Patent on Chinese Firm Exports

### Event Study



*Note*: This figure plots event-study estimates for the effects of a successful first US patent application and a more lenient USPTO patent examiner on the exports of first-time Chinese applicants. The sample covers all CCTS-PatEx matched exporters. The dependent variable is log exports. The regressors comprise interactions of time dummies with an indicator for a successful patent application in Panel A and with the patent examiner's demeaned approval rate in Panel B. Both regressions include firm fixed effects and HS2 sector by year pair fixed effects. Heteroskedasticity-consistent standard errors are clustered by examiner art unit.

### First US Patent Promotes Chinese Firms' Export Growth

| Dependent variable           | Annualized 3-year export growth |               |                 |               |               |                             |  |  |  |
|------------------------------|---------------------------------|---------------|-----------------|---------------|---------------|-----------------------------|--|--|--|
|                              | (1)                             | (2)           | (3)             | (4)           | (5)           | (6)                         |  |  |  |
| Successful USPTO application | 0.0667***                       | $0.172^{***}$ | 0.175***        | $0.0599^{**}$ | $0.217^{***}$ | 0.201***                    |  |  |  |
|                              | (0.0214)                        | (0.0564)      | (0.0522)        | (0.0253)      | (0.0691)      | (0.0621)                    |  |  |  |
| Log exports                  |                                 |               | $-0.0367^{***}$ |               |               | $-0.0457^{***}$             |  |  |  |
|                              |                                 |               | (0.00492)       |               |               | (0.00593)                   |  |  |  |
| Export tenure                |                                 |               | -0.00299        |               |               | -0.0141***                  |  |  |  |
| • • ·                        |                                 |               | (0.00366)       |               |               | (0.00371)                   |  |  |  |
| Log employment               |                                 |               |                 |               |               | $0.0294^{***}$<br>(0.00856) |  |  |  |
|                              |                                 |               |                 |               |               | (0.00850)                   |  |  |  |
| HS2-year fixed effects       | Yes                             | Yes           | Yes             |               |               |                             |  |  |  |
| Industry-year fixed effects  |                                 |               |                 | Yes           | Yes           | Yes                         |  |  |  |
| Ownership-year fixed effects |                                 |               |                 | Yes           | Yes           | Yes                         |  |  |  |
| Model                        | OLS                             | 2SLS          | 2SLS            | OLS           | 2SLS          | 2SLS                        |  |  |  |
| Sample                       |                                 | CCTS          |                 |               | CCTS-ASI      | E                           |  |  |  |
| F-stat                       |                                 | 198.07        | 195.26          |               | 147.05        | 147.44                      |  |  |  |
| # Observations               | 1,156                           | 1,156         | 1,156           | 940           | 940           | 940                         |  |  |  |

Note: This table reports the estimated effect of a successful first U.S. patent application on the subsequent export growth of Chinese applicants. The dependent variable is the annualized 3-year export growth rate. The sample covers all CCTS-PAEX matched exporters in Columns 1-3 and all CCTS-ASIE-PAEX matched exporters in Columns 4-6. Columns 1 and 4 are estimated with OLS, while Columns 2, 3, 5, and 6 are estimated with 2SLS, using the demeaned examiner approval rate as an instrument. Column 5 arounds for initial log exports and export tenure. Column 6 further controls for initial log exports and export tenure. Column 6 turther controls for genelogment. Columns 1-3 include HS2 sector by year pair fixed effects, while Columns 4-6 include CIC2 industry by year and ownership type by year pair fixed effects. Heteroskedasticity-consistent standard errors are clustered by examiner art unit. \*\*\* p < 0.01.

#### ▶ Placebo Test → Alternative Specifications → Controlling for Global Patenting

#### ▶ The Effect of Second Application

### Firm Export Growth Decomposition

The export growth rate can be decomposed into two components.

$$\Delta_k Export \equiv \frac{Export_k - Export_0}{0.5(Export_k + Export_0)}$$
$$= \underbrace{\frac{\sum_{\omega \in \Omega_0} (x_{\omega k} - x_{\omega 0})}{0.5(Export_k + Export_0)}}_{Incumbent\ Component} + \underbrace{\frac{\sum_{\omega \in \Omega_k \setminus \Omega_0} x_{\omega k}}{0.5(Export_k + Export_0)}}_{New\ Component}$$

► The "incumbent" component: contribution of incumbent destination-product pairs

- **The "continuing" component**: Value change of continuing destination-product pairs
- **The "drop" component**: Value destruction from dropped destination-product pairs
- ► **The "new" component**: contribution of value creation from newly added destination-product pairs

### Firm Export Growth Decomposition

### Main driver (88%): survival and expansion in incumbent destination-product markets

| Dependent variable           |                           | nent of annualized<br>dest-prod markets | 3-year export growth<br>New dest-prod markets |  |  |  |
|------------------------------|---------------------------|---|---|--|--|--|
|                              | (1)                       | (2)                                     | (3)   | (4)                                      |  |  |
| Successful USPTO application | $0.153^{***}$<br>(0.0486) | 0.153***<br>(0.0487)                    | 0.0195<br>(0.0309)                            | 0.0217<br>(0.0260)                       |  |  |
| Log exports                  |                           | -0.00562<br>(0.00407)                   |   | -0.0311***<br>(0.00232)                  |  |  |
| Export tenure                |                           | (0.00407)<br>-0.0000904<br>(0.00314)    |   | (0.00232)<br>$-0.00290^{*}$<br>(0.00149) |  |  |
| HS2-year fixed effects       | Yes                       | Yes                                     | Yes   | Yes                                      |  |  |
| F-stat                       | 198.07                    | 195.26                                  | 198.07  | 195.26                                   |  |  |
| # Observations               | 1,156                     | 1,156                                   | 1,156   | 1,156                                    |  |  |

Note: This table reports the estimated effect of a successful first U.S. patent application on constituent components of the subsequent export growth of Chinese applicants. The dependent variable in Columns 1-2 and 3-4 is the contribution of expansion in a firm's incumbert and new destination-product markets respectively to its total export growth. The sample covers all CCTS-PAIEX matched exporters. All columns 2 and 4 control for initial log exports and export the argument and new destination with 28LS, using the demanded examiner approval rate as an instrument. Columns 2 and 4 control for initial log exports and export tenuer. All columns include HS2 sector by year pair fixed effects. Heteroskedasticity-consistent standard errors are clustered by examiner art unit. \*\*\* p < 0.01, \*\* p < 0.05,

▶ Three-part Decomposition

▶ CCTS-ASIE Sample

▶ Export Margins

▶ Exports by Firm-Destination-Product

Why Does First U.S. Patent Boost Chinese Firm Exports?

# Mechanism Test I: Firm Export Growth Decomposition

We decompose each firm's export growth by product/destination groups:

$$\Delta_k EX_i \equiv \frac{EX_{ik} - EX_{i0}}{0.5(EX_{ik} + EX_{i0})} = \sum_{p \in P} \sum_{d \in D} \frac{EX_{ipdk} - EX_{ipd0}}{0.5(EX_{ik} + EX_{i0})},$$

 $\blacktriangleright$  p: product category

- Technologically related versus technologically unrelated
- ▶ High quality differentiation versus Low quality differentiation
- ▶ High contract reliance versus low contract reliance
- $\blacktriangleright$  d: destination category
  - ▶ U.S. versus non-U.S.
  - ▶ high GDP per capita versus low GDP per capita
  - ▶ high rule-of-law index versus low rule-of-law index

▶ We regress each of the components on first U.S. patent application outcome to identify the "main driver" of patent-induced export growth

### Mechanism Test II: Export Growth Across Markets Within Firms

We apply a specification similar to Eckel et. al (2015):

 $y_{ipdt+k} = \beta_w \cdot \mathbb{1}(\text{Successful First Application} = 1)_{it} \cdot C(d) + \Gamma_w Z_{ipdt} + \eta_{i\tau} + \lambda_{p\tau} + \lambda_{d\tau} + \epsilon_{ipdt+k}$ 

- $\blacktriangleright$  p denotes HS6 products, d denotes destination countries.
- $y_{ipdt+k}$  is the outcome variable
  - ▶ Extensive margin: survival dummy of incumbent pairs
  - ▶ Intensive margin: value/price growth of continuing pairs
- $\blacktriangleright$  C(d): destination characteristics (U.S. indicator, GDP per capita, rule-of-law index)
- $\blacktriangleright$   $Z_{ipdt}$ : log initial destination-product pair export and relative export tenure
- ▶  $\lambda_{p\tau}$  ( $\lambda_{d\tau}$ ): product (destination) by application year fixed effects
- ▶  $\eta_{i\tau}$ : firm fixed effects to control for heterogeneity across firms
- ▶ Coefficient of interest:  $\beta_w$  (within-firm heterogeneous responses across destinations)

# Mechanism I: Monopoly Power

**Hypothesis 1**: U.S. patent rights strengthen exporters' monopoly power and sales of protected products in the U.S. market, but not of other destination-product markets

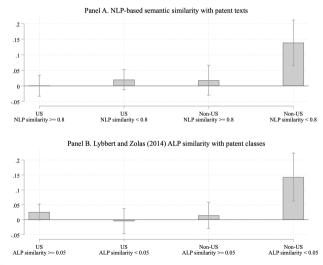
To test Hypothesis 1, we examine:

- ▶ whether the patent effect is driven by technologically related products sold in the U.S.
- ▶ whether the values and prices of those export flows are improved

We identify products that are technologically related to a given patent based on two alternative semantic similarity analyses

- Apply NLP techniques to compute the semantic similarity between textual descriptions of individual patents and HS-6 products (similar to Argente et al. 2023)
   The NLP-based semantic similarity
- Apply Algorithmic Links with Probabilities (ALP) weighting methods by Goldschlag, et al. (2020) to the descriptions of USPC technology classes and HS-6 products
   The ALP weighting algorithm

### Weak Evidence for Monopoly Power Mechanism Evidence 1a: Firm export growth decomposition



### Weak Evidence for Monopoly Power Mechanism Evidence 1b: Export Growth Across Markets Within Firms

| Dependent variable                         | Export value growth |            |           | Export price growth |            |           |  |
|--|---------------------|------------|-----------|---------------------|------------|-----------|--|
| Technologically related products           | All<br>(1)          | Yes<br>(2) | No<br>(3) | All<br>(4)          | Yes<br>(5) | No<br>(6) |  |
| Successful USPTO application $\times$ U.S. | 0.112               | -0.120     | 0.295     | 0.0497              | 0.0186     | 0.0322    |  |
| Succession CSF FO application × 0.5.       | (0.112)             | (0.1120)   | (0.194)   | (0.0647)            | (0.0995)   | (0.103)   |  |
| F-stat                                     | 6.96                | 20.06      | 3.89      | 6.33                | 25.19      | 3.43      |  |
| # Observations                             | 38,824              | 14,601     | 23,517    | 31,226              | 12,129     | 18,524    |  |

Panel A. NLP-based semantic similarity with patent texts

Panel B. Lybbert and Zolas (2014) ALP similarity with patent classes

| Dependent variable                         | Export value growth |                   |                  | Export price growth |                   |                    |  |
|--|---------------------|-------------------|------------------|---------------------|-------------------|--------------------|--|
| Technologically related products           | All                 | Yes               | No               | All                 | Yes               | No                 |  |
|  | (1)                 | (2)               | (3)              | (4)                 | (5)               | (6)                |  |
| Successful USPTO application $\times$ U.S. | 0.112<br>(0.115)    | -0.133<br>(0.243) | 0.139<br>(0.121) | 0.0497<br>(0.0647)  | 0.0432<br>(0.165) | 0.0149<br>(0.0738) |  |
| F-stat                                     | 6.96                | 7.83              | 5.93             | 6.33                | 8.82              | 5.23               |  |
| # Observations                             | 38,824              | 7,774             | 30,411           | 31,226              | 6,634             | 24,061             |  |

| Controls      | Firm-dest-prod level log exports and relative export tenure |
|---------------|---|
| Fixed effects | Firm-year, HS6-year, and destination-year fixed effects     |

Note: This table reports the heterogeneous effect of a successful first U.S. patent application on the growth in export values and prices across destinations and products within firms, for the sample of continuing firm-destination-product triplets of CCTS-PatEx matched exporters. The variable U.S. is an indicator equal to 1 if the export destination is the U.S. The standalone term of Successful USPTO application is absorbed by the firm by year pair fixed effects. Columns 1 and 4 cover all products, while Columns 2 and 5 (Columns 3 and 6) restrict the sample to products that are technologically related (unrelated) to a firm's patent. Products are technologically related to a patent or patent technology class if their descriptions have semantic similarity above 80% based on the NLP method in Panel A (see Appendix 7? for details) and ALP weights above 6% based on Lybbert and Zolas (2014) approach in Panel B. All columns are estimated with 2SLS, using the demended examiner approval rate as an instrument. All columns three lower particular with part and Heterosekasticity-consistent standard errors are clustered by examiner at run it. \*\*\* p < 0.05, \*\* p < 0.1.

# Mechanism II: Asymmetric Information

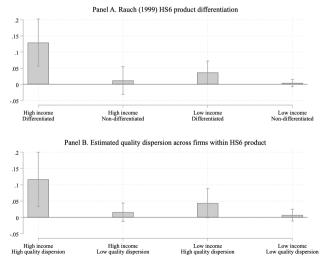
**Hypothesis 2**: U.S. patent grant constitutes a signal that alleviates information frictions in international trade

- ▶ Quality capacity signal: firms' output quality capacity under quality differentiation
- ▶ Contract credibility signal: firms' trustworthiness under contractual frictions

To test Hypothesis 2, we examine:

- (quality capacity) whether U.S. patents increase firm exports disproportionately more for products with greater scope for quality differentiation, in richer destinations
- (contract credibility) whether U.S. patents increase firm exports disproportionately more for products with greater contract reliance, to destinations with stronger contract enforcement

### Strong Evidence for Quality Capacity Signal Evidence 2a: Firm export growth decomposition



### Strong Evidence for Quality Capacity Signal

### Evidence 2b: Export Growth Across Markets Within Firms

#### Panel A. Rauch (1999) HS6 product differentiation

| Dependent variable   | Su           | rvival Indica | ator     | Exp      | ort value gr | owth     |
|--|--------------|---------------|----------|----------|--------------|----------|
| Differentiated products  | All          | Yes           | No       | All      | Yes          | No       |
|  | (1)          | (2)           | (3)      | (4)      | (5)          | (6)      |
| Successful USPTO application $\times \ln(\text{GDP per capita})$ | $0.0207^{*}$ | $0.0302^{**}$ | 0.00159  | 0.00255  | -0.00423     | 0.0330   |
|  | (0.0119)     | (0.0130)      | (0.0248) | (0.0194) | (0.0220)     | (0.0407) |
| F-stat   | 32.59        | 26.78         | 49.92    | 21.14    | 18.35        | 16.92    |
| # Observations   | 85,955       | 70,123        | 10,555   | 38,665   | 32,251       | 4,112    |

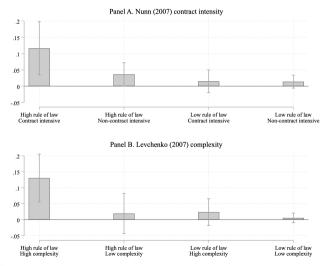
Panel B. Estimated quality dispersion across firms within HS6 product

| Dependent variable   | Survival Indicator |               |          | Export value growth |          |          |
|--|--------------------|---------------|----------|---------------------|----------|----------|
| High quality-dispersion products                                 | All                | Yes           | No       | All                 | Yes      | No       |
|  | (1)                | (2)           | (3)      | (4)                 | (5)      | (6)      |
| Successful USPTO application $\times \ln(\text{GDP per capita})$ | $0.0207^{*}$       | $0.0285^{**}$ | -0.0107  | 0.00255             | 0.000385 | 0.0142   |
|  | (0.0119)           | (0.0134)      | (0.0228) | (0.0194)            | (0.0236) | (0.0217) |
| F-stat   | 32.59              | 25.99         | 56.73    | 21.13               | 15.27    | 37.11    |
| # Observations   | 85,955             | 71,677        | 13,557   | 38,665              | 31,753   | 6,430    |
|  |                    |               |          |                     |          |          |

| Controls      | Firm-dest-prod level log exports and relative export tenure |
|---------------|---|
| Fixed effects | Firm-year, HS6-year, and destination-year fixed effects     |

Note: This table reports the heterogeneous effect of a successful first U.S. patent application on the survial probability and export growth across destinations and products within firms. The variable in(2019 per capita) is the log CDP per capita) as the log CDP per log CDP per capita) as the log CDP per per capita) as the log CDP per capita)

### Strong Evidence for Contract Credibility Signal Evidence 3a: Firm export growth decomposition



#### Strong Evidence for Contract Credibility Signal Evidence 3b: Export Growth Across Markets Within Firms

| Dependent variable                                | Sur      | vival Indica  | itor     | Expe     | ort value gr | owth     |
|---|----------|---------------|----------|----------|--------------|----------|
| High-contract-intensity industries                | All      | Yes           | No       | All      | Yes          | No       |
|   | (1)      | (2)           | (3)      | (4)      | (5)          | (6)      |
| Successful USPTO application $\times$ rule of law | 0.0308** | $0.0358^{**}$ | 0.0253   | 0.00472  | 0.00269      | 0.0261   |
|   | (0.0149) | (0.0147)      | (0.0304) | (0.0242) | (0.0233)     | (0.0534) |
| F-stat  | 25.96    | 23.85         | 21.73    | 17.49    | 14.31        | 13.43    |
| # Observations                                    | 86,319   | 56,481        | 29,237   | 38,752   | 26,283       | 12,009   |

Panel A. Nunn (2007) contract intensity

Panel B. Levchenko (2007) complexity

| Dependent variable                                | Survival Indicator |               | itor     | Exp      | ort value gr | owth     |
|---|--------------------|---------------|----------|----------|--------------|----------|
| High-complexity industries                        | All                | Yes           | No       | All      | Yes          | No       |
|   | (1)                | (2)           | (3)      | (4)      | (5)          | (6)      |
| Successful USPTO application $\times$ rule of law | 0.0308**           | $0.0374^{**}$ | 0.0152   | 0.00472  | -0.00686     | 0.0523   |
|   | (0.0149)           | (0.0148)      | (0.0252) | (0.0242) | (0.0253)     | (0.0437) |
| F-stat  | 25.96              | 20.37         | 26.27    | 17.49    | 15.65        | 10.41    |
| # Observations                                    | 86,319             | 54,390        | 31,388   | 38,752   | 25,162       | 13,106   |
|   |                    |               |          |          |              |          |

| Controls      | Firm-dest-prod level log exports and relative export tenure |
|---------------|---|
| Fixed effects | Firm-year, HS6-year, and destination-year fixed effects     |

Note: This table reports the heterogeneous effect of a successful first U.S. patent application on the survival probability and export growth across destinations and products within firms. The variable rule of law is the index value of rule of law of the destination country. The standalone term of Successful USPTO application is absorbed by the firm by year pair fixed effects. The sample in Columns 1-3 (Columns 4-6) covers all incumbent (all continuing) firm-destination-product triplets for CCTS-PAtEx matched exporters. Columns 1-3 (low) contrast relance above (below) the median. Industries 'contrast relance is proxied with the Nunn (2007) measure of contrast relance is proxied with the Nunn (2007) measure of contrast relance is proxied with the Nunn (2007) measure of contrast relance is proxied with the Nunn (2007) measure of contrast relance is proxied with the Nunn (2007) measure of contrast relance is proxied with the Nunn (2007) measure of contrast relance is proxied with the Nunn (2007) measure of contrast relance is proxied with the Nunn (2007) measure of contrast relance above (below) the median include HS6 by year, destination by year, and firm by year pair fixed effects, and control for firm-destination-product level initial log exports and relative tenure. Heteroskedasticity-consistent standard effects, and control for firm-destination-product level initial log exports and relative tenure. Heteroskedasticity-consistent standard effects areas an instrument at unit. \*\*\* p < 0.01, \*\* p < 0.01, \*\* p < 0.01.

# Ruling Out Other Mechanisms

#### ► Financial constraints

- ▶ U.S. patents may signal higher expected future profits and thereby attract external investors and ease financial frictions faced by exporters

#### ► Follow-on innovation

- ▶ First U.S. patent may improve exporters' expectations about their future innovation or patenting success, and hence induce them to conduct more R&D, upgrade product quality, and climb up the value chain
- However, we find little evidence that the first U.S. patent stimulates patenting in China
   Patent filing in China

# Conclusions

#### Conclusions

- ▶ We identify a large causal effect of a successful first U.S. patent application on a Chinese firm's subsequent export growth
- ▶ Unpacking potential mechanisms, we find evidence consistent with U.S. patents signaling product quality and contractual credibility under asymmetric information
  - ▶ Limited evidence for monopoly power mechanism
  - ▶ No evidence for financial frictions and follow-on innovation mechanisms
- ▶ Open questions
  - Global patent policy
  - ▶ Welfare effects of patent hubs
  - Trade and patents with GVCs and MNCs

# Thanks!

Appendix

### Anecdotal Evidence

► GRG Banking Equipment: the

company filed its first U.S. patent in 2011. *People.com*, the online version of the largest state-owned newspaper *People Daily*, described the event as "another breakthrough for Chinese ATM companies in overseas, especially in Europe and America."

▶ Founder Microelectronics: the company filed its first U.S. patent in 2012. On its official website, the company described the patent as "another important milestone of Founder Microelectronics' IP work."



### An Illustrative Example of the Matching Procedures

Take Shanghai Microelectronics Equipment Co. as an example.

- 1. The company filed its first U.S. patent application on Aug. 19, 2005.
  - ▶ It was about an electronic component.
  - The patent was granted on Mar. 4, 2008 (it normally takes 2.5-3 years).
- 2. We search the keywords "Microelectronics Equipment" and "Shanghai" in search engines.
  - The company's registered Chinese name is: 上海微电子装备有限公司
  - We cross-check the names with a database of company registrations (*Tianyancha*).

| (45) Date of Patent: Mar. 4, 2008  |
|--|
| 6,835,941 B1* 12/2004 Tanaka 250/491.1<br>6,864,602 B2* 3/2005 Korenaga  |
| 6,927,505 B2 * 8/2005 Binnard et al  |
| Han-Sam Cho and Hyun-Kyo Jung, Analysis and Design of Syn-<br>chronous Permanent-Magnet Planar Motors, IEEE Transactions of<br>Energy Conversion, vol. 17, No. 4, Dec. 2002.   |
| Ir. J.C. Compter, Electro-dynamic planar motor, Department of<br>Mechanical Engineering, Section Precision Engineering, Technical<br>University Eindhoven, Eindhoven, The Netherlands, Aug. 13, 2003,<br>Science Direct, Precision Engineering 28 (2004) 171-180, available  |
| at www.sciencedirect.com.  |
| (Continued)  |
| Primary Examiner—Darren Schuberg<br>Assistant Examiner—Iraj A. Mohandesi   |
| (74) Attorney, Agent, or Firm—Michael Best & Friedrich<br>LLP  |
| (57) ABSTRACT  |
| According to the invention, configurations of X-windings<br>and Y-windings in a synchronous permanent planar motor<br>are improved, X-windings and Y-windings overlap in the<br>direction normal to the planar magnet array and distribute on<br>the entire surface of the thrust core, such that effective wires<br>in the X-windings and Y-windings are lengthered and   |
| increased in number, therefore the electromagnetic force<br>generated by the SPMPM of this invention is increased  |
| correspondingly, X-winiting, and Y-winitings are mounde<br>on a thrust core made of iron matterial, thus the electromag-<br>netic force is further increased, in addition, two separate<br>anii-yawing member are provided on the mover for com-<br>tensity years of the mover, accordingly interference<br>to properly and the increased of the electromagnetic force<br>for progeting is eliminated.<br>8 Claims, 6 Drawing Sheets |
|  |

### Technology Classes of First Patent Applications

| Sample | e: all first-time | e USPTO patent applicants from China                              |        |               |
|--------|-------------------|---|--------|---------------|
| Rank   | USPC class        | USPC title  | Number | Percentage (% |
| 1      | 514               | Drug, bio-affecting and body treating compositions                | 266    | 5.55          |
| 2      | 424               | Drug, bio-affecting and body treating compositions                | 196    | 4.09          |
| 3      | 435               | Chemistry: molecular biology and microbiology                     | 144    | 3.01          |
| 4      | 362               | Illumination  | 112    | 2.34          |
| 5      | 439               | Electrical connectors   | 84     | 1.75          |
| 6      | 257               | Active solid-state devices  | 77     | 1.61          |
| 7      | 455               | Telecommunications  | 71     | 1.48          |
| 8      | 361               | Electricity: electrical systems and devices                       | 69     | 1.44          |
| 9      | 428               | Stock material or miscellaneous articles                          | 68     | 1.42          |
| 10     | 345               | Computer graphics processing and selective visual display systems | 67     | 1.40          |
|        |                   | Other   | 3637   | 75.91         |
| Sample | e: first-time U   | SPTO patent applicants matched to CCTS                            |        |               |
| Rank   | USPC class        | USPC title  | Number | Percentage (% |
| 1      | 424               | Drug, bio-affecting and body treating compositions                | 117    | 4.13          |
| 2      | 514               | Drug, bio-affecting and body treating compositions                | 96     | 3.39          |
| 3      | 362               | Illumination  | 86     | 3.04          |
| 4      | 435               | Chemistry: molecular biology and microbiology                     | 80     | 2.83          |
| 5      | 439               | Electrical connectors   | 66     | 2.33          |
| 6      | 428               | Stock material or miscellaneous articles                          | 50     | 1.77          |
| 7      | 257               | Active solid-state devices  | 45     | 1.59          |
| 8      | 345               | Computer graphics processing and selective visual display systems | 41     | 1.45          |
| 9      | 361               | Electricity: electrical systems and devices                       | 40     | 1.41          |
| 10     | 536               | Organic compounds   | 34     | 1.20          |
|        |                   | Other   | 2116   | 76.86         |
|        |                   |   |        |               |

Note: This table shows the top 10 technology classes of the first USPTO patent applications filed by Chinese applicants. The top panel considers all first-time Chinese applicants to the USPTO. The bottom considers the subset of first-time Chinese applicants to the USPTO in the matched CCTS-PatEx sample.

### Comparison of U.S. Patent Applicants and Other Exporters

|                                       | Matched patent applicants |          | Other  | exporters | Difference      |          |
|---------------------------------------|---------------------------|----------|--------|-----------|-----------------|----------|
|                                       | Mean                      | St. Dev. | Mean   | St. Dev.  | Mean            | St. Dev. |
| Log exports                           | 15.28                     | 2.71     | 13.16  | 2.34      | 2.12***         | 0.021    |
| Log exports to the U.S.               | 10.01                     | 6.61     | 5.00   | 6.14      | $5.01^{***}$    | 0.054    |
| Log exports to OECD                   | 13.14                     | 5.11     | 9.94   | 5.65      | $3.21^{***}$    | 0.050    |
| Share of exports to the U.S.          | 0.22                      | 0.30     | 0.14   | 0.28      | $0.090^{***}$   | 0.0025   |
| Share of exports to OECD              | 0.54                      | 0.36     | 0.52   | 0.41      | $0.024^{***}$   | 0.0037   |
| Number of products                    | 16.18                     | 40.87    | 14.58  | 48.41     | $1.59^{***}$    | 0.43     |
| Number of destinations                | 19.68                     | 21.14    | 8.39   | 12.76     | $11.29^{***}$   | 0.11     |
| Avg exports per dest-prod (1,000 RMB) | 1423.76                   | 8081.73  | 405.49 | 5826.35   | $1018.28^{***}$ | 51.67    |
| # Observations                        |                           | 12,850   | 2,3    | 18,957    |                 |          |

Note: This table compares CCTS-PatEx matched exporters to other CCTS exporters. Columns 1-2 and 3-4 show the mean and standard deviation of key export statistics in the panel, respectively for CCTS-PatEx matched Chinese patent applicants and for all other CCTS exporters. Columns 5 and 6 show the mean and standard deviation of the difference in export statistics between the two groups. \*\*\* p < 0.01, \*\* p < 0.05, \*\* p < 0.01.

## Comparison of U.S. Patent Applicants and Other Exporters

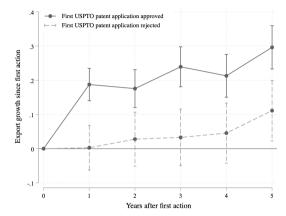
|   | Matched patent applicants |        | Other exporters |       | Differences   |                     |
|---|---------------------------|--------|-----------------|-------|---------------|---------------------|
|   | Mean                      | sd     | Mean            | sd    | Mean          | $\operatorname{sd}$ |
| Log value of processing export                | 9.04                      | 7.63   | 4.86            | 6.37  | 4.18***       | 0.056               |
| Log value of export of heterogeneous products | 13.41                     | 5.19   | 11.25           | 4.87  | $2.15^{***}$  | 0.043               |
| Log value of export to high-RLI countries     | 14.45                     | 4.08   | 11.80           | 4.34  | $2.65^{***}$  | 0.038               |
| Log value of export to high-IPR countries     | 15.00                     | 3.13   | 12.44           | 3.55  | $2.57^{***}$  | 0.031               |
| Share of processing export                    | 0.34                      | 0.41   | 0.20            | 0.35  | $0.14^{***}$  | 0.003               |
| Share of heterogeneous products               | 0.75                      | 0.39   | 0.76            | 0.39  | -0.0070**     | 0.003               |
| Share of export to high-RLI countries         | 0.81                      | 0.27   | 0.76            | 0.34  | $0.043^{***}$ | 0.003               |
| Share of export to high-PRI countries         | 0.90                      | 0.20   | 0.85            | 0.28  | $0.051^{***}$ | 0.002               |
| Number of observations                        |                           | 12,850 | 2,31            | 8,957 |               |                     |

Note: This table displays the additional comparison of PatEx-CCTS matched exporters and other exporters in CCTS. Column 1 and 2 show the mean and standard deviations of key export statistics of the PatEx-CCTS matched Chinese patent applicants across all years; Column 3 and 4 show the mean and standard deviations of key export statistics of the other exporters. Column 5 and 6 show the mean and standard deviation of the differences in export statistics between the two groups. \*\*\* p < 0.01, \*\* p < 0.05, \* p < 0.1.

#### An Illustrative Example of the Patent Examination Process Still take Shanghai Microelectronics Equipment Co. as an example.

- 1. The company filed its first patent application (US7339289B2) on Aug. 19, 2005.
- 2. The case was first assigned to the art unit 2834, and then assigned to an examiner, Iraj Mohandesi, on Jul. 10, 2006.
  - ▶ Mr. Mohandesi examined 419 patent applications, of which 365 were finally approved.
- 3. The first action (a non-final rejection) was issued on Aug. 10, 2006.
  - The first action decision normally takes place about 1.5-2 years after the initial filing (Dyer et al., 2020).
  - We define the first *Notice of Allowance* or *Non-final Rejection*, whichever comes first, as the first action by USPTO.
  - ▶ The first action (initial decision) date is used as the starting point of the effect (Kline et al., 2019; Farre-Mensa, Hegde, and Ljungqvist, 2020).
    - Much of the uncertainty is resolved by the first action.
  - The application underwent another round of non-final rejection before obtaining a notice of allowance.
- 4. The patent was granted on Mar. 4, 2008.

### Export Growth since First Application



Note: This figure shows the average export growth rate of successful and unsuccessful first-time Chinese applicants to the USPTO, following the first action year of the application. Export growth is measured as  $g_{ik} = (exp_{it+k} - exp_{it})/0.5(exp_{it+k} + exp_{it})$ , where  $exp_{it}$  is the exports of firm *i* in *t*, the first action year of its first patent application, and  $exp_{it+k}$  is the exports of firm *i* k years after *t*. 95% confidence intervals are represented by the capped spikes.

#### Balance Tests

| Sample                           | Firm Characteristic           | $Successful \ USPTO \ application$ | $Examiner\ approval\ rate$ |
|----------------------------------|-------------------------------|------------------------------------|----------------------------|
|                                  | Log exports (CCTS)            | -0.0209                            | 0.0893                     |
|                                  | Log exports (CC15)            | (0.162)                            | (0.463)                    |
|                                  | Log # products                | -0.149*                            | -0.0974                    |
|                                  | 108 // Freduces               | (0.0756)                           | (0.227)                    |
| CCTS (Sample size $= 1,156$ )    | Log # destinations            | -0.0252                            | 0.141                      |
|                                  | 0.1                           | (0.0746)                           | (0.197)                    |
|                                  | Log avg exports per dest-prod | 0.0942                             | 0.0223                     |
|                                  |                               | (0.125)                            | (0.373)                    |
|                                  | Log sales                     | 0.0363                             | -0.366                     |
|                                  |                               | (0.143)                            | (0.341)                    |
|                                  | Log employment                | -0.0109                            | -0.0127                    |
|                                  |                               | (0.0977)                           | (0.244)                    |
| CCTS-ASIE (Sample size = $940$ ) | Log exports (ASIE)            | 0.241                              | -0.343                     |
|                                  |                               | (0.189)                            | (0.532)                    |
|                                  | Operating profit margin       | 0.00974                            | -0.0323                    |
|                                  |                               | (0.00930)                          | (0.0223)                   |

Note: This table reports results from regressing CCTS or CCTS-ASIE matched exporters' *ex-mat* characteristics on an indicator for a successful patent application and on examiner approval rate. The CCTS sample covers continuing exporters matched to USPTO patent applicants. The CCTS-ASIE sample covers all continuing CCTS exporters matched to both USPTO and ASIE. Regressions on the CCTS sample control for HS2 sector by year pair fixed effects. Regressions on the CCTS-ASIE sample control for CIC2 industry by year and ownership type by year pair fixed effects. Heteroskedasticity-consistent standard errors are clustered by examiner at unit. \*\*\* p < 0.01, \*\* p < 0.01, \*\* p < 0.01, \*\*

#### Balance Tests

| Sample                        | Firm Characteristic                                    | Successful USPTO application | Examiner approval rat |
|-------------------------------|--|------------------------------|-----------------------|
|                               |  |                              |                       |
|                               | Share of tech. related exports (conservative with NLP) | 0.0219                       | $0.145^{**}$          |
|                               |  | (0.0286)                     | (0.0666)              |
|                               | Share of tech. related exports (liberal with ALP)      | 0.00972                      | 0.113                 |
|                               |  | (0.0306)                     | (0.0708)              |
|                               | Share of differentiated exports                        | -0.0376*                     | 0.0427                |
|                               |  | (0.0201)                     | (0.0608)              |
|                               | Share of high-quality-dispersion exports               | 0.0182                       | 0.0302                |
|                               |  | (0.0263)                     | (0.0607)              |
|                               | Share of contract intensive exports                    | -0.00328                     | 0.0206                |
| CCTS (Sample size $= 1,156$ ) |  | (0.0138)                     | (0.0371)              |
|                               | Share of high-complexity exports                       | -0.00101                     | 0.0268                |
|                               |  | (0.0232)                     | (0.0571)              |
|                               | Share of exports to the U.S.                           | -0.0405*                     | 0.0127                |
|                               |  | (0.0220)                     | (0.0466)              |
|                               | Share of exports to high-income countries              | -0.0452**                    | -0.0349               |
|                               |  | (0.0175)                     | (0.0431)              |
|                               | Share of exports to high-rule-of-law index countries   | -0.0329**                    | -0.0616               |
|                               |  | (0.0146)                     | (0.0390)              |

Note: This table reports results from regressing exporters' ex-ante characteristics on an indicator for a successful patent application and on examiner approval rate. The sample covers all continuing CCTS-PAEX matched exporters. All regressions control for HS2 by application year pair fixed effects. Heteroskedasticity-consistent standard errors are clustered by examiner art unit. "\*\*\* p < 0.01, "\* p < 0.05, " p < 0.05,"

## Testing for Examiner Specialization

Righi and Simcoe (2019) point out that examiners may specialize in certain patents.

- Validation test: "[U]nder random assignment, the inclusion of control variables should not affect the magnitude of the estimated coefficients."
  - We use an alternative instrument that also excludes technology class by application year fixed effects.
  - We include examiner characteristics as controls (examiner's experience and number of foreign/Chinese patents examined).
- ▶ The point estimates fluctuate between 80% to 100%.

| в | $\mathbf{a}$ | c | k |
|---|--------------|---|---|
|   |              |   |   |

| Dependent variable                  | Su             | ccessful USI  | TO applicat    | ion           |
|-------------------------------------|----------------|---------------|----------------|---------------|
|                                     | (1)            | (2)           | (3)            | (4)           |
| Examiner approval rate (residual 1) | 0.968***       | 0.870***      |                |               |
|                                     | (0.0693)       | (0.0894)      |                |               |
| Examiner approval rate (residual 2) |                |               | $0.993^{***}$  | $0.872^{***}$ |
|                                     |                |               | (0.0678)       | (0.0882)      |
| Log exports                         | 0.00227        | 0.00165       | 0.00323        | 0.00233       |
|                                     | (0.00567)      | (0.00572)     | (0.00579)      | (0.00584)     |
| Export tenure                       | $-0.00789^{*}$ | -0.00766*     | -0.00770*      | -0.00741*     |
|                                     | (0.00436)      | (0.00435)     | (0.00453)      | (0.00448)     |
| Log examiner's Chinese applications |                | -0.0142       |                | -0.0170       |
|                                     |                | (0.0230)      |                | (0.0235)      |
| Log examiner's foreign applications |                | 0.0610**      |                | 0.0767***     |
|                                     |                | (0.0267)      |                | (0.0269)      |
| Log examiner's years of experience  |                | -0.0488       |                | -0.0601       |
|                                     |                | (0.0425)      |                | (0.0428)      |
| HS2-year fixed effects              | Yes            | Yes           | Yes            | Yes           |
| F-test: $IV = 0$                    | $195.26^{***}$ | $94.70^{***}$ | $214.36^{***}$ | $97.61^{***}$ |
| # Observations                      | 1,156          | 1,156         | 1,156          | 1,156         |

Note: This table reports validation test results for the ecogeneity of patent assignment to examiners. The sample covers all CCTS-PatEs matched exporters. Examiner approval rate (residual 2) is an examiner's approval rate (residual 2) is an examiner's approval rate (metaned by both rat unit and first-action year. Examiner approval rate (residual 2) is an examiner's approval rate (metaned by both rat unit by first-action year. All columns control for HS2 sector by year pair fixed effects. Heteroskedasticity-consistent standard errors are clustered by examiner at unit: \*\* p < 0.01, \*\* > 0.0.

#### Placebo Test

| Dependent variable           | Annualized | d 3-year expor | t growth, 3-year lagged |
|------------------------------|------------|----------------|-------------------------|
|                              | (1)        | (2)            | (3)                     |
| Successful USPTO application | 0.00381    | 0.00926        | 0.0115                  |
|                              | (0.00845)  | (0.0223)       | (0.0215)                |
| Log exports, 3-year lagged   |            |                | -0.00952***             |
|                              |            |                | (0.00146)               |
| Export tenure, 3-year lagged |            |                | -0.00917 ***            |
|                              |            |                | (0.00136)               |
| HS2-year fixed effects       | Yes        | Yes            | Yes                     |
| Model                        | OLS        | 2SLS           | 2SLS                    |
| F-stat                       |            | 154.13         | 152.46                  |
| # Observations               | 947        | 947            | 947                     |

Note: This table reports the estimated effect of a successful first U.S. patent application on the 3-year lagged annualized export growth of Chinese applicants as a placebo text. The sample covers all CCTS-PatEx matched exporters. Column 1 is estimated with OLS, while Columns 2 and 3 are estimated with 2SLS, using the demeaned examiner approval rate as an instrument. Column 3 controls for 3-year lagged log exports and export tenure. All columns include HS2 sector by year pair fixed effects. Heteroskedasticity-consistent standard errors are clustered by examiner art unit. \*\*\* p < 0.01. \*\* p < 0.1.

#### Alternative Specifications

| Dependent variable                  | Annualized 3-year export growth |                |            |                  |               |               |               |  |  |
|-------------------------------------|---------------------------------|----------------|------------|------------------|---------------|---------------|---------------|--|--|
|                                     | Baseline                        | Alternative IV | Bootstrap  | Examiner control | 1             | lternative FE | ls .          |  |  |
|                                     | (1)                             | (2)            | (3)        | (4)              | (5)           | (6)           | (7)           |  |  |
| Successful USPTO application        | 0.175***                        | 0.160***       | 0.180***   | 0.247***         | $0.179^{***}$ | $0.193^{***}$ | $0.172^{***}$ |  |  |
|                                     | (0.0522)                        | (0.0540)       | (0.0530)   | (0.0734)         | (0.0487)      | (0.0513)      | (0.0492)      |  |  |
| Log exports                         | -0.0367***                      | -0.0367***     | -0.0382*** | -0.0367***       | -0.0398***    | -0.0376***    | -0.0379***    |  |  |
|                                     | (0.00492)                       | (0.00491)      | (0.00468)  | (0.00499)        | (0.00473)     | (0.00400)     | (0.00405)     |  |  |
| Export tenure                       | -0.00299                        | -0.00313       | -0.00207   | -0.00248         | -0.000505     | -0.00242      | -0.00163      |  |  |
|                                     | (0.00366)                       | (0.00364)      | (0.00363)  | (0.00381)        | (0.00381)     | (0.00294)     | (0.00305)     |  |  |
| Log examiner's Chinese applications |                                 |                |            | 0.000780         |               |               |               |  |  |
| · · · ·                             |                                 |                |            | (0.0149)         |               |               |               |  |  |
| Log examiner's foreign applications |                                 |                |            | -0.0204          |               |               |               |  |  |
|                                     |                                 |                |            | (0.0210)         |               |               |               |  |  |
| Log examiner's years of experience  |                                 |                |            | 0.00210          |               |               |               |  |  |
|                                     |                                 |                |            | (0.0278)         |               |               |               |  |  |
| HS2-application year fixed effects  | Yes                             | Yes            | Yes        | Yes              |               |               |               |  |  |
| HS2-first-action year fixed effects | 100                             | 100            | 100        |                  | Yes           |               |               |  |  |
| Application year fixed effects      |                                 |                |            |                  |               | Yes           |               |  |  |
| First-action year fixed effects     |                                 |                |            |                  |               |               | Yes           |  |  |
| F-stats                             | 195.26                          | 214.36         |            | 94.70            | 156.55        | 187.19        | 182.60        |  |  |
| Observations                        | 1,156                           | 1,156          | 1.156      | 1,156            | 1.171         | 1.282         | 1.282         |  |  |

Note: This table reports the estimated effect of a successful first U.S. patent application on the subsequent export growth of Chinese applicants, controlling for patent family submissions to EPO, JPO, and CNIPA. The dependent variable is the annualized 3-year export growth rate. All columns include an indicator for whether an application from the same patent family is verified respectively with FPO, JPO, and CNIPA. Column 1 is estimated with OLS, while Columns 2 and 3 are estimated with SZS, using the demenand examiner approval rate as an instrument. Heteroskinatic/icvo-nsistent standard errors are clustered by examiner at unit. \*\*\* p < 0.01, \*\* p < 0.03, \* p < 0.03, \* p < 0.01, \*

### Controlling for Global Patenting

| Dependent variable                           | Annualiz        | ed 3-year expe | ort growth |
|--|-----------------|----------------|------------|
|  | (1)             | (2)            | (3)        |
| Successful USPTO application                 | 0.0674***       | 0.187***       | 0.171**    |
|  | (0.0200)        | (0.0529)       | (0.0678)   |
| Successful USPTO application× USPTO priority |                 |                | 0.0434     |
|  |                 |                | (0.106)    |
| Log exports                                  | $-0.0378^{***}$ | -0.0380***     | -0.0381**  |
|  | (0.00493)       | (0.00501)      | (0.00503)  |
| Export tenure                                | -0.00344        | -0.00239       | -0.00227   |
|  | (0.00349)       | (0.00367)      | (0.00370)  |
| USPTO priority                               | -0.00218        | -0.00693       | -0.0351    |
|  | (0.0247)        | (0.0250)       | (0.0775)   |
| EPO application                              | 0.00134         | 0.00357        | 0.00475    |
|  | (0.0234)        | (0.0242)       | (0.0243)   |
| JPO application                              | -0.0334         | -0.0380        | -0.0376    |
|  | (0.0232)        | (0.0238)       | (0.0239)   |
| CNIPA application                            | 0.0197          | 0.0190         | 0.0187     |
|  | (0.0240)        | (0.0245)       | (0.0243)   |
| HS2-year fixed effects                       | Yes             | Yes            | Yes        |
| Model  | OLS             | IV             | IV         |
| F-stat                                       |                 | 191.28         | 57.73      |
| # Observations                               | 1,101           | 1,101          | 1,101      |

#### The Effect of Second Application

| Dependent variable                  | Annualized 3-year export growth |                    |                    |  |  |  |
|-------------------------------------|---------------------------------|--------------------|--------------------|--|--|--|
|                                     | (1)                             | (2)                | (3)                |  |  |  |
| Successful second USPTO application | 0.0262<br>(0.0177)              | 0.0309<br>(0.0853) | 0.0502<br>(0.0824) |  |  |  |
| Log exports                         |                                 |                    | -0.0104***         |  |  |  |
|                                     |                                 |                    | (0.00278)          |  |  |  |
| Export tenure                       |                                 |                    | -0.00167           |  |  |  |
|                                     |                                 |                    | (0.00243)          |  |  |  |
| HS2-year fixed effects              | Yes                             | Yes                | Yes                |  |  |  |
| Model                               | OLS                             | 2SLS               | 2SLS               |  |  |  |
| F-stat                              |                                 | 10.87              | 11.19              |  |  |  |
| # Observations                      | 274                             | 274                | 274                |  |  |  |

Note: This table reports the estimated effect of a successful second U.S. patent application on the subsequent export growth of Chinese applicates, conditional on a first patent application being successful. The dependent variable is the annualized 3-year export growth rate. The sample covers CUTS-PatkEr matched exporters with a successful first U.S. patent application. Column 1 is estimated with OLS, while Columns 2 and 3 are estimated with 25%, using the demension examines approval rate as an instrument. Column 3 controls fixed effects. Heteroskedasticity-consistent standard errors are clustered by examiner art unit. \*\*\* p < 0.01. \*\*p < 0.01.

### Three-part Decomposition

| Dependent variable           | Components of annualized 3-year export growth |                          |                        |                        |                    |                         |  |  |
|------------------------------|---|--------------------------|------------------------|------------------------|--------------------|-------------------------|--|--|
|                              | Continuing                                    | dest-prod markets        | Dropped des            | t-prod markets         | New dest-          | New dest-prod markets   |  |  |
|                              | (1)   | (2)                      | (3)                    | (4)                    | (5)                | (6)                     |  |  |
| Successful USPTO application | 0.0678*<br>(0.0358)                           | 0.0681*<br>(0.0349)      | -0.0850***<br>(0.0311) | -0.0851***<br>(0.0309) | 0.0195<br>(0.0309) | 0.0217<br>(0.0260)      |  |  |
| Log exports                  |   | -0.00977***<br>(0.00292) |                        | -0.00415*<br>(0.00241) |                    | -0.0311***<br>(0.00232) |  |  |
| Export tenure                |   | -0.00244<br>(0.00209)    |                        | -0.00235<br>(0.00204)  |                    | -0.00290*<br>(0.00149)  |  |  |
| HS2-year fixed effects       | Yes   | Yes                      | Yes                    | Yes                    | Yes                | Yes                     |  |  |
| F-stat                       | 198.07  | 195.26                   | 198.07                 | 195.26                 | 198.07             | 195.26                  |  |  |
| # Observations               | 1,156   | 1,156                    | 1,156                  | 1,156                  | 1,156              | 1,156                   |  |  |

Note: This table reports the estimated effect of a successful first U.S. patent application on constituent components of the export growth of Chinese applicants. The sample covers all CCTS-Patter matched coverse. All columns are estimated with 25LS, using the demeaned examiner approval rate as an instrument. Columns 2, 4, and 6 control for initial log exports and export tenure. All columns include HS2 sector by year pair fixed effects. Heteroskedattcity-consistent standard errors are clustered by examiner at unit. \*\*\* p < 0.01. \*\* p < 0.05. \*\* p < 0.05.

#### ASIE Decomposition

| Dependent variable  | Components of annualized 3-year export growth<br>Incumbent dest-prod markets New dest-prod markets |                         |                      |  |  |  |  |
|---|--|-------------------------|----------------------|--|--|--|--|
|   | (1)  | (2)                     | (3)                  | (4)                                      |  |  |  |
| Successful USPTO application                                | 0.157**<br>(0.0628)  | 0.153**<br>(0.0610)     | 0.0598**<br>(0.0286) | 0.0480**<br>(0.0230)                     |  |  |  |
| Log exports   |  | -0.0120**<br>(0.00550)  |                      | -0.0337***<br>(0.00323)                  |  |  |  |
| Export tenure   |  | -0.00724**<br>(0.00332) |                      | -0.00685***<br>(0.00156)                 |  |  |  |
| Log employment  |  | 0.0110<br>(0.00719)     |                      | (0.00100)<br>$0.0184^{***}$<br>(0.00421) |  |  |  |
| In Annature Court of Courts                                 | Yes  | Yes                     | Yes                  | Yes                                      |  |  |  |
| Industry-year fixed effects<br>Ownership-year fixed effects | Yes  | Yes                     | Yes                  | Yes                                      |  |  |  |
|   |  |                         | 100                  |  |  |  |  |
| F-stat  | 147.05   | 147.44                  | 147.05               | 147.44                                   |  |  |  |
| # Observations  | 940  | 940                     | 940                  | 940                                      |  |  |  |

Note: This table reports the estimated effect of a successful first U.S. patent application on constituent components of export growth of Chinese applicatuats in the subsample of CCTS-ASE-PatEs matched exporters. All columns are estimated with 23LS, using the demanded examiner approval rate as an instrument. Columns 2, 4, and 6 control for initial log exports, export tenure, and log employment. All columns include CIC2 industry by year and ownership type by year pair fixed effects. Heteroskedasticity-consistent standard errors are cultured by examiner at unit. \*\*\* p < 0.01, \*\* p < 0.01, \* p < 0.01, \*

#### Export Margins

| Dependent variable           | Annualized 3-year growth |               |                    |                                  |  |  |  |
|------------------------------|--------------------------|---------------|--------------------|----------------------------------|--|--|--|
|                              | # Prod<br>(1)            | # Dest<br>(2) | # Dest-prod<br>(3) | Avg exports per dest-prod<br>(4) |  |  |  |
| Successful USPTO application | 0.0660                   | 0.0531        | $0.0782^{*}$       | $0.114^{**}$                     |  |  |  |
|                              | (0.0412)                 | (0.0344)      | (0.0406)           | (0.0478)                         |  |  |  |
| Log exports                  | -0.00183                 | -0.0128***    | -0.0104 * * *      | -0.0372***                       |  |  |  |
|                              | (0.00329)                | (0.00297)     | (0.00361)          | (0.00407)                        |  |  |  |
| Export tenure                | $-0.00442^{**}$          | -0.00541 **   | $-0.00626^{***}$   | 0.00286                          |  |  |  |
|                              | (0.00224)                | (0.00212)     | (0.00232)          | (0.00310)                        |  |  |  |
| HS2-year fixed effects       | Yes                      | Yes           | Yes                | Yes                              |  |  |  |
| F-stat                       | 195.26                   | 195.26        | 195.26             | 195.26                           |  |  |  |
| # Observations               | 1,156                    | 1,156         | 1,156              | 1,156                            |  |  |  |

Note: This table reports the estimated effect of a successful first U.S. patent application on the annualized 3-year growth rate of different export margins of Chinese applicants. The sample covers all CCTS-PatEx matched exporters. All columns are estimated with 25LS, using the demeaned examiner approval rate as an instrument. All columns findule HS2 sector by year pair fixed effects, and control for initial log exports and export tenure. Heteroskedasticity-consistent standard errors are clustered by examiner and unit:  $*^{**} p < 0.01$ ,  $*^{**} p < 0.1$ .

#### Firm-destination-product Level Outcomes

Panel A. Market survival and export growth conditional on survival

| Dependent variable           | St        | urvival indic | ator         | $E_{c}$  | Export value growth |          |  |  |
|------------------------------|-----------|---------------|--------------|----------|---------------------|----------|--|--|
|                              | (1)       | (2)           | (3)          | (4)      | (5)                 | (6)      |  |  |
| Successful USPTO application | 0.0768*** | 0.127         | $0.143^{**}$ | 0.0218   | 0.0836              | 0.233*** |  |  |
|                              | (0.0177)  | (0.0809)      | (0.0693)     | (0.0143) | (0.0614)            | (0.0821) |  |  |
| F-stat                       |           | 27.97         | 105.87       |          | 21.20               | 57.23    |  |  |
| # Observations               | 86,681    | $86,\!681$    | $86,\!681$   | 38,940   | 38,940              | 38,940   |  |  |

Panel B. Export price and quantity growth conditional on survival

| Dependent variable           | $E_{2}$            | cport price g       | rowth                | Export quantity growth |                     |                          |  |
|------------------------------|--------------------|---------------------|----------------------|------------------------|---------------------|--------------------------|--|
|                              | (1)                | (2)                 | (3)                  | (4)                    | (5)                 | (6)                      |  |
| Successful USPTO application | 0.0195<br>(0.0144) | -0.0764<br>(0.0728) | -0.00433<br>(0.0786) | 0.00875<br>(0.0176)    | 0.135**<br>(0.0682) | $0.211^{**}$<br>(0.0917) |  |
| F-stat                       | (0.0144)           | 15.10               | 45.66                | (0.0176)               | (0.0682)<br>15.10   | (0.0917)<br>45.66        |  |
| # Observations               | 31,320             | 31,320              | 31,320               | 31,320                 | 31,320              | 31,320                   |  |

| Controls      | Firm level log exports and export tenure                    |    |             |     |    |             |  |  |
|---------------|---|----|-------------|-----|----|-------------|--|--|
|               | Firm-dest-prod level log exports and relative export tenure |    |             |     |    |             |  |  |
| Fixed effects | HS6-year and destination-year fixed effects                 |    |             |     |    |             |  |  |
| Model         | OLS   | IV | Weighted IV | OLS | IV | Weighted IV |  |  |

Note: This table reports the estimated effect of a successful first U.S. patent application on the survival probability of incumbent firm-destination-product triplets and the growth in export value, price, and quantity of continuing firm-destination-product triplets. The sample in Columns 1-3 of Panel A (Panel B and Columns 4-6 of Panel A) covers all incumbent (all continuing) firm-destination-product triplets for CCTS-PatEx matched exporters. Columns 1 and 4 are estimated with OLS, while Columns 2, 3, 5, and 6 are estimated with 2SLS, using the demenand examiner approval rate as an instrument. Columns 3 and 6 weight observations by their initial value share in a firm's export portfolio. All columns include HSb by year and destination by year pair fixed effects, and control for firm'-level initial log exports and tenure and firm-destination-product level initial log exports and relative tenure. Heteroskedasticity-consistent standard errors are clustered by examiner art unit. \*\*\* p < 0.01, \*\* p < 0.5.

- ▶ We compute the semantic similarity between patent texts and HS6 products following steps similar to Argente et al. (2023)
  - 1. Compile the key textual information from each patent application record, including the patent title, abstract, and USPC technology class description
  - 2. Concatenate and preprocess both textual datasets to remove unwanted characters and stop words
  - 3. Apply the lemmatizing algorithm using the WordNetLemmatizer from the NLTK Python module, which reduces words to their base or dictionary forms
  - 4. Vectorize the preprocessed datasets using the text-embedding-ada-002 model developed by OpenAI (similar to OpenAI' s GPT-2 model)
  - 5. Compute the cosine similarities between each patent word vector
    - ▶ The similarity score threshold is set at 0.8, which is about the 99 percentile of the distribution of similarity scores

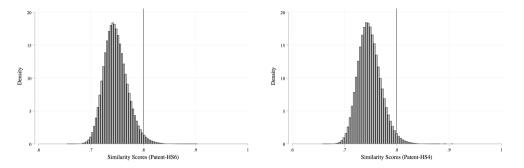


Figure: Distributions of Similarity Scores

Note: This figure plots the distributions of similarity scores between the patent texts and HS descriptions. The left panel shows the distribution of similarity scores between patent texts and descriptions of HS 6-digit codes, and the right panel shows the distribution of similarity scores between patent texts and descriptions of HS 4-digit codes.

Validation check 1

- $\blacktriangleright$  <u>Patent title</u>: fluorescent lamp driver
- ▶ Patent abstract: the present invention discloses a kind of fluorescent lamp driver, which consists of the multi-switch converting circuit, power transformer (t1), resonant inductor (l1), resonant capacitor (c3) and step-up transformer (t2). it features the followings: the primary winding (pw) of t1 connects with the ac output of multi-switch converting circuit. l1 and c3, after series connection, connect with the secondary winding (sw) of t1 through the pw of t2. the sw of t2 connects with the load output. in this invention, a resonant inductor is connected in series on the resonant loop to realize frequency and voltage modulation as well as the soft switch function of the primary power switch of the power transformer.
- ▶ USPC Description: electric lamp and discharge devices: systems

▶ Matched HS6 codes

- 1. $850410^*$  Discharge lamps or tubes; ballasts therefor
- 2. 900661 Photographic flashlight apparatus; discharge lamp (electronic)
- $3.\ 850490$  Electrical transformers, static converters and inductors; parts thereof

Validation check 2

- ▶ <u>Patent title</u>: automatic tv standard determination method and apparatus thereof
- ▶ Patent abstract: an apparatus for automatically determining a tv standard of a tv channel comprises a frequency identification module and a determination module. the frequency identification module identifies a carrier frequency of an audio if signal of the tv channel to generate a frequency identification result. the determination module, which coupled to the frequency identification module, determines the tv standard of the tv channel according to the frequency identification result.
- ▶ USPC Description: television
- ► Matched HS6 codes
  - 1. 852510 Transmission apparatus; for radio-telephony, radio-telegraphy, radio-broadcasting or television, whether or not incorporating reception or sound recording and reproducing apparatus
  - 2. 852520<sup>\*</sup> Transmission apparatus; for radio-telephony, radio-telegraphy, radio-broadcasting or television, with reception apparatus, with or without sound recording or reproducing apparatus
  - 3. 852813 Television receivers; black and white or other monochrome, whether or not incorporating radio broadcast receivers or sound or video recording or reproducing apparatus

## The ALP Weighting Algorithm

- ▶ The ALP weights are developed using the methodology from Lybbert and Zolas (2014).
  - 1. Compare keywords in 6-digit HS industry descriptions with keywords in patent abstracts.
  - 2. Tabulate the number of patents for each USPC/CPC to industry/product classification combination based on the m-to-m matches
  - 3. Re-weight the results using a modified Bayesian weighting scheme, the 'hybrid' weighting approach
    - It increases the weights of the specific matches and reduces the weights of the generalized matches
  - 4. For details, see Lybbert and Zolas (2014) and Goldschlag, Lybbert, and Zolas (2019).

### Decomposition by Types: Monopoly Power

F-stat

# Observations

Panel A. NLP-based semantic similarity with patent texts

|                              | U.S.  | U.S.   | Non-U.S.  | Non-U.S.                  |
|------------------------------|---|--|---|---------------------------|
|                              | Related   | Unrelated  | Related   | Unrelated                 |
|                              | (1)   | (2)  | (3)   | (4)                       |
| Successful USPTO Application | $\begin{array}{c} 0.000594 \\ (0.0171) \end{array}$ | $\begin{array}{c} 0.0202\\ (0.0167) \end{array}$ | $\begin{array}{c} 0.0182 \\ (0.0246) \end{array}$ | $0.139^{***}$<br>(0.0371) |

Panel B. Lybbert and Zolas (2014) ALP similarity with patent classes

|                              | U.S.<br>Related<br>(1)                                | U.S.<br>Unrelated<br>(2) | Non-U.S.<br>Related<br>(3)                        | Non-U.S.<br>Unrelated<br>(4) |
|------------------------------|---|--------------------------|---|------------------------------|
| Successful USPTO Application | $\begin{array}{c} 0.0256^{*} \\ (0.0135) \end{array}$ | -0.00485<br>(0.0213)     | $\begin{array}{c} 0.0145 \\ (0.0224) \end{array}$ | $0.143^{***}$<br>(0.0409)    |
| Controls                     |   | og exports an            |   |                              |
| HS2-year fixed effects       | Yes   | Yes                      | Yes   | Yes                          |

| # Observations   | 1,100   | 1,100  | 1,100  | 1,100  |
|--|---|--|--|--|
| Note: This table reports the estimate<br>constituent components of the export gr<br>posed four-way into exports to the U.S<br>technologically related vs. unrelated to to<br>a patent or patent technology class if the<br>on the NLP method in Panel A (see Ap<br>on Lybbert and Zolas (2014) approach i<br>exporters. All columns are estimated with<br>an instrument. All columns are include BIS | d effect of a<br>owth of Chin<br>. vs. Rest o<br>he firm's pa-<br>ir description<br>pendix ?? for<br>n Panel B. 7<br>th 2SLS, usi | successful first<br>nese applicants.<br>If the World (F<br>tent. Products<br>ns have semanti<br>r details) and A<br>Che sample cove<br>ng the demean | t U.S. patent<br>Total firm gr<br>tOW) and pro<br>are technologi<br>ic similarity ab<br>ALP weights a<br>ers all CCTS-I<br>ed examiner a | application on<br>owth is decom-<br>ducts that are<br>cally related to<br>ove 80% based<br>bove 5% based<br>PatEx matched<br>pproval rate as |
| log exports and firm export tenure. Hete<br>examiner art unit. *** $p < 0.01$ , ** $p <$   | roskedasticit   | y-consistent sta   |  |  |

195.257

1 1 5 6

195.257

1 1 5 6

195.257

1 156

195.257

1 156

#### Export Growth by Types: Monopoly Power

Panel A. NLP-based semantic similarity with patent texts

|                              | U.S.<br>Related<br>(1) | U.S.<br>Unrelated<br>(2) | Non-U.S.<br>Related<br>(3) | Non-U.S.<br>Unrelated<br>(4) |
|------------------------------|------------------------|--------------------------|----------------------------|------------------------------|
| Successful USPTO Application | 0.0419                 | $0.178^{*}$              | 0.0624                     | $0.191^{***}$                |
|                              | (0.138)                | (0.106)                  | (0.0833)                   | (0.0730)                     |
| F-stat                       | 74.43                  | 133.06                   | 125.96                     | 182.68                       |
| # Observations               | 604                    | 791                      | 834                        | 1,051                        |

Panel B. Lybbert and Zolas (2014) ALP similarity with patent classes

|                              | U.S.<br>Related<br>(1) | U.S.<br>Unrelated<br>(2) | Non-U.S.<br>Related<br>(3) | Non-U.S.<br>Unrelated<br>(4) |
|------------------------------|------------------------|--------------------------|----------------------------|------------------------------|
| Successful USPTO Application | 0.211                  | $0.213^{**}$             | 0.0746                     | $0.181^{***}$                |
|                              | (0.191)                | (0.0977)                 | (0.119)                    | (0.0639)                     |
| F-stat                       | 36.05                  | 129.75                   | 103.40                     | 189.08                       |
| # Observations               | 447                    | 878                      | 677                        | 1,108                        |

| Controls               | Lo  | g exports a | nd export ter | nure |
|------------------------|-----|-------------|---------------|------|
| HS2-year fixed effects | Yes | Yes         | Yes           | Yes  |

 $\overline{Mote}$ : This table reports the estimated effect of a successful first U.S. patent application on the subsequent export growth of Chinese applicants in each of four market types. These market types are defined based on the destination country (U.S. vs. Rest of the World, ROW) and product type (technologically related vs. unrelated to the firm's patent). Products are technologically related to a patent or patent technology class if their descriptions have semantic similarity above 80% based on the NLP method in Panel A (see Appendix ?? for details) and ALP weights above 80% based on the NLP method in Panel A (see Appendix ?? for details) and ALP weights above 80% based on the NLP method in Panel A (see Appendix ?? for details) and ALP weights above rate as an instrument. All columns are estimated with 2SLS, using the demeaned examiner approval rate as an instrument. All columns include HS2 sector by year pair fixed effects, and control for initial log exports and firm export tenure. Heteroskedasticity-consistent standard errors are clustered by examiner at multi. \*\* p < 0.0.1, \*\* p < 0.0.1, \*\* p < 0.0.1, \*\*

### Decomposition by Types: Quality Signal

| Panel A. Rauch (1999) HS6 prod | uct differentiation |                    |                |                    |
|--------------------------------|---------------------|--------------------|----------------|--------------------|
|                                | High income         | High income        | Low income     | Low income         |
|                                | Differentiated      | Non-differentiated | Differentiated | Non-differentiated |
|                                | (1)                 | (2)                | (3)            | (4)                |
| Successful USPTO Application   | 0.128***            | 0.0123             | 0.0341*        | 0.00395            |
|                                | (0.0374)            | (0.0219)           | (0.0176)       | (0.00571)          |

Panel B. Estimated quality dispersion across firms within HS6 product

|                              | High income<br>High quality dispersion<br>(1) | High income<br>Low quality dispersion<br>(2) | Low income<br>High quality dispersion<br>(3) | Low income<br>Low quality dispersion<br>(4) |
|------------------------------|---|--|--|---|
| Successful USPTO Application | 0.106***                                      | 0.0256                                       | 0.0307*                                      | 0.0173                                      |
|                              | (0.0394)                                      | (0.0325)                                     | (0.0177)                                     | (0.0140)                                    |
|                              |   |  |  |   |
| Controls                     |   | Log exports an                               | d export tenure                              |   |
| HS2-year fixed effects       | Yes   | Yes  | Yes  | Yes   |
| F-stat                       | 195.26  | 195.26                                       | 195.26                                       | 195.26                                      |
| # Observations               | 1,156   | 1,156  | 1,156  | 1,156                                       |

. Note: This table reports the estimated effect of a successful first U.S. patent application on constituent components of the export growth of Chinese applicants. Total firm growth is decomposed burveny into exports to high vs. low-income countries and products with high vs. low scope for quality differentiation. The sample covers all CCTS-PatEx matched exporters. All columns are estimated with 25LS, using the demensed examiner approval rate as an instrument. All columns include HS2 sector by year pair fixed effects, and control for initial log exports and firm export tenure. Heteroskedasticity-consistent standard errors are clustered by examiner at unit. \*\*\* p = 0.01. \* p < 0.01. \*

#### Export Growth by Types: Quality Signal

Panel A. Rauch (1999) HS6 product differentiation

|                              | High income<br>Differentiated<br>(1) | High income<br>Non-differentiated<br>(2) | Low income<br>Differentiated<br>(3) | Low income<br>Non-differentiated<br>(4) |
|------------------------------|--------------------------------------|--|-------------------------------------|---|
| Successful USPTO Application | 0.133**                              | 0.115                                    | 0.0420                              | 0.133                                   |
|                              | (0.0649)                             | (0.101)                                  | (0.0845)                            | (0.162)                                 |
| F-stat                       | 179.53                               | 135.60                                   | 147.76                              | 75.38                                   |
| # Observations               | 1,063                                | 760                                      | 875                                 | 431                                     |

Panel B. Estimated quality dispersion across firms within HS6 product

|                                    | High income<br>High quality dispersion<br>(1) | High income<br>Low quality dispersion<br>(2) | Low income<br>High quality dispersion<br>(3) | Low income<br>Low quality dispersion<br>(4) |
|------------------------------------|---|--|--|---|
| Successful USPTO Application       | 0.158**                                       | 0.0603                                       | 0.0733                                       | 0.331**                                     |
|                                    | (0.0642)                                      | (0.0934)                                     | (0.0897)                                     | (0.138)                                     |
| F-stat                             | 173.753                                       | 146.97                                       | 146.076                                      | 89.311                                      |
| # Observations                     | 1,099   | 689  | 911  | 447   |
| Controls<br>HS2-year fixed effects | Yes   | Log exports an<br>Yes                        | d export tenure<br>Yes                       | Yes   |

Note: This table reports the estimated effect of a successful first U.S. patent application on the subsequent export growth of Chinese applicants in each of four market types. These market types are defined based on the destination country (high-income vs. low-income) and product type (high vs. low scope for quality differentiation). The sample covers all CUTSP-atts matched exporters. All columns are estimated with 23K3, using the demenated examiner approval rate as an instrument. All columns include HS2 sector by year pair fixed effects, and control for initial log exports and firm export tenure. Heteroskedasticity-consistent standard errors are clustered by examiner at unit. \*\*\*P = 0.01. \*\* p < 0.01. \*\* p <

### Decomposition by Types: Contractual Signal

Panel A. Nunn (2007) contract intensity

|                                | High rule of law<br>Contract intensive<br>(1) | High rule of law<br>Non-contract intensive<br>(2) | Low rule of law<br>Contract intensive<br>(3) | Low rule of law<br>Non-contract intensive<br>(4) |
|--------------------------------|---|---|--|--|
| Successful USPTO Application   | 0.115***                                      | 0.0369**  | 0.0150                                       | 0.0125   |
|                                | (0.0418)                                      | (0.0184)  | (0.0176)                                     | (0.00981)  |
| Panel B. Levchenko (2007) comp | olexity                                       |   |  |  |
|                                | High rule of law<br>High complexity<br>(1)    | High rule of law<br>Low complexity<br>(2)         | Low rule of law<br>High complexity<br>(3)    | Low rule of law<br>Low complexity<br>(4)         |
| Successful USPTO Application   | 0.130***                                      | 0.0191  | 0.0217                                       | 0.00581  |
| **                             | (0.0382)                                      | (0.0320)  | (0.0212)                                     | (0.00770)  |
| Controls                       |   | Log exports an                                    | d export tenure                              |  |
| HS2-year fixed effects         | Yes   | Yes   | Yes  | Yes  |
| F-stat                         | 195.26  | 195.26  | 195.26                                       | 195.26   |
| # Observations                 | 1,156   | 1,156   | 1,156  | 1,156  |

Note: This table reports the estimated effect of a successful first U.S. patent application on constituent components of the export growth of Chinese applicants. Total firm growth is decomposed four-way into exports to countries with high vs. low contact reliance. The sample covers all CCTS-PatEx matched exporters. All columns are estimated with 2SLS, using the demeand examiner approval rate as an instrument. All columns include HS2 sector by year pair fixed effects, and control for initial log exports and firm export tenuer. Heterosidenticity-consistent standard errors are clustered by examiner at unit. \*\*\* p < 0.01, \*\* p < 0.01, \*\*

#### Export Growth by Types: Contractual Signal

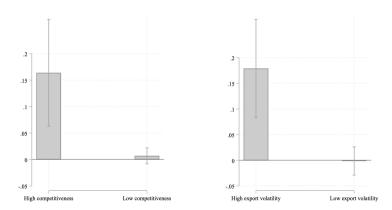
|                                | High rule of law<br>Contract intensive<br>(1) | High rule of law<br>Non-contract intensive<br>(2) | Low rule of law<br>Contract intensive<br>(3) | Low rule of law<br>Non-contract intensive<br>(4) |
|--------------------------------|---|---|--|--|
| Successful USPTO Application   | 0.112*<br>(0.0578)                            | 0.199**<br>(0.0977)                               | 0.0880<br>(0.0991)                           | 0.234<br>(0.145)                                 |
| F-stat                         | 177.79  | 133.13  | 131.87                                       | 78.63  |
| # Observations                 | 1,047   | 887   | 799  | 542  |
| Panel B. Levchenko (2007) comp | plexity                                       |   |  |  |
|                                | High rule of law                              | High rule of law                                  | Low rule of law                              | Low rule of law                                  |
|                                | High complexity                               | Low complexity                                    | High complexity                              | Low complexity                                   |

Panel A. Nunn (2007) contract intensity

|                              | High rule of law<br>High complexity<br>(1) | High rule of law<br>Low complexity<br>(2) | Low rule of law<br>High complexity<br>(3) | Low rule of law<br>Low complexity<br>(4) |
|------------------------------|--|---|---|--|
| Successful USPTO Application | $0.115^{*}$                                | 0.0576                                    | 0.153                                     | 0.0397                                   |
|                              | (0.0669)                                   | (0.0738)                                  | (0.0992)                                  | (0.113)                                  |
| F-stat                       | 170.25                                     | 174.76                                    | 122.36                                    | 135.54                                   |
| # Observations               | 985  | 972                                       | 723                                       | 630                                      |
| Controls                     |  | Log exports a                             | nd export tenure                          |  |
| HS2-year fixed effects       | Yes  | Yes                                       | Yes                                       | Yes                                      |

Note: This table reports the estimated effect of a successful first U.S. patent application on the subsequent export growth of Chinese applicants in each of four market types. These market types are defined based on the destination country (high vs. low rule of law) and product type (high vs. low contract reliance). The sample covers all CUTS-Patkz matched exporters. All columns are estimated with 2SLS, using the demeaned examiner approval rate as an instrument. All columns include HS2 sector by year pair fixed effects, and control for initial log exports and firm export tenure. Heterosidenticity-consistent standard errors are clustered by examiner at unit. \*\*\* p < 0.01, \*\* p < 0.01,

### Additional Evidence of the Signaling Mechanism



# Additional Evidence of the Signaling Mechanism (Cont.)

| Panel A. | Destination-product | market | HH |
|----------|---------------------|--------|----|
|----------|---------------------|--------|----|

| $Dependent\ variable$                     | Survival Indicator<br>(1) | Export value growth (2) |
|---|---------------------------|-------------------------|
| Successful USPTO application $\times$ HHI | $-0.401^{***}$<br>(0.110) | 0.0407<br>(0.107)       |
| F-stat                                    | 33.83                     | 21.87                   |
| # Observations                            | 86,627                    | 38,822                  |

Panel B. Export volatility in the destination-product market

| $Dependent \ variable$                                  | Survival Indicator<br>(1)  | Export value growth (2) |  |
|---|--|-------------------------|--|
| Successful USPTO application $\times$ Export volatility | 0.271**<br>(0.107)   | -0.176<br>(0.126)       |  |
| F-stat  | 32.99  | 20.74                   |  |
| # Observations  | 86,091   | 38,797                  |  |
| Controls  | Firm-dest-prod level log exports, relative export tenure,<br>and HHI/export volatility |                         |  |
| Fixed effects   | Firm-year, HS6-year, and destination-year fixed effects                                |                         |  |

Note: This table reports the heterogeneous effect of a successful first U.S. patent application on the survival probability and export growth across destination-product markets within firms. The sample in Columns 1 (Columns 2) covers all incumbert (all continuing) firm-destination-product trajelates for CCTS-PatEx matched exporters. Destination-product trajects have high information asymmetry if their competitiveness is above the median in Panel A and if their alse volatility is above the median in Panel B. Market computitiveness is the Herfindhal Index (HHI) across Chinese exporters in a given destination-product scattering the exposite of variation of exports within a firm-destination-product very intervent effects and a scattering the exposite of variation of exports within a firm-destination-product very across firms to the destination-product level. All columns are estimated with 2SLS, using the demeaned examiner approval rate as an instrument. All columns include HS6 by year, destination by year, and firm by year pair fixed effects, and control for firm-destination-product level initial log exports and relative tenure. Heteroskedasticity-consistent standard errors are clustered by examiner atrunit. \*\*\* p < 0.01, \*\* p < 0.05, \* p < 0.1.

#### Heterogeneous Effects by Export Tenure

| Dependent variable           | Annualized 3-year export growth |                 |            |  |
|------------------------------|---------------------------------|-----------------|------------|--|
|                              | (1)                             | (2)             | (3)        |  |
| Successful USPTO application | 0.175***                        | 0.236***        | 0.0996     |  |
|                              | (0.0522)                        | (0.0788)        | (0.0790)   |  |
| Log exports                  | -0.0367***                      | -0.0412***      | -0.0274*** |  |
|                              | (0.00492)                       | (0.00606)       | (0.00915)  |  |
| Export tenure                | -0.00299                        | -0.0103         | -0.00371   |  |
|                              | (0.00366)                       | (0.00981)       | (0.00764)  |  |
| HS2-year fixed effects       | Yes                             | Yes             | Yes        |  |
| Sample                       | All applicants                  | Tenure $\leq 5$ | Tenure > 5 |  |
| F-stat                       | 187.19                          | 81.17           | 65.46      |  |
| # Observations               | 1,156                           | 646             | 427        |  |

Note: This table reports the heterogeneous effect of a successful first U.S. patent application on the subsequent annalized 3-year export growth of Chinese applications with different export tenure. The sample in Columns 1 covers all CCTS-PatEx matched exporters. The sample in Column 2 (3) covers CCTS-PatEx matched exporters with export tenure below (above) the median (5 years). All columns are estimated with 281S, using the demeaned examiner approval rate as an instrument. All columns include 182 sector by year pair fixed effects, and control for initial log exports and export tenure. Heteroskelasticity-consistent standard errors are elustered by examiner art unit:  $w^+ p < 0.01$ ,  $w^+ p < 0.01$ .

#### Testing the Financial Constraint Mechanism

| Dependent variable           | Annualized 3-year export growth |                      |                          |                      |                     |                      |
|------------------------------|---------------------------------|----------------------|--------------------------|----------------------|---------------------|----------------------|
|                              | External Finnancial Dependence  |                      | Liquidity Needs          |                      | Asset Tangibility   |                      |
| Firm Fin Vulnerability       | High<br>(1)                     | $_{(2)}^{Low}$       | High<br>(3)              | Low<br>(4)           | High<br>(5)         | Low<br>(6)           |
| Successful USPTO application | 0.149**<br>(0.0682)             | 0.183***<br>(0.0615) | $0.154^{**}$<br>(0.0619) | 0.226***<br>(0.0766) | 0.138**<br>(0.0659) | 0.263***<br>(0.0813) |
| Difference (High - Low)      |                                 | -0.0368<br>(0.0894)  |                          | 799<br>1971)         |                     | 130<br>9999)         |
| Controls                     | Log exports, export tenure      |                      |                          |                      |                     |                      |
| HS2-year fixed effects       | Yes                             | Yes                  | Yes                      | Yes                  | Yes                 | Yes                  |
| K-P rk Wald F-stats          | 147.46                          | 135.58               | 180.43                   | 101.28               | 138.46              | 102.99               |
| Observations                 | 473                             | 644                  | 646                      | 470                  | 591                 | 511                  |

Note: This table reports the heterogeneous effect of a successful first U.S. patent application on the subsequent annualized 3-year export growth of Chinese applicants with different levels of financial vulnerability. The sample in Columns 1, 3, and 5 (2, 4, and 6) covers CCTS-PatEx matched exporters with financial vulnerability above (below) the median. A firm's financial vulnerability is measured with the weighted average of industry-level financial vulnerability, using industries' share of firm exports as weights. Industry's financial vulnerability is measured by their external finance dependence, liquidity needs (invention-to-sales ratio), or asset tangibility. All columns are estimated with 2SLS, using the demendence maproval rate as an instrument. All columns include HS2 sector by year pair fixed effects, and control for initial log exports and export tenure. Heteroskedasticity-consistent standard errors are culsered by examiner at unit. \*\*\* p < 0.01, \*\* p < 0.05, \* p < 0.1.

### Patent Filing in China

| Dependent variable           | Annualized 3-year growth of CNIPA patents |                |                       |  |  |
|------------------------------|---|----------------|-----------------------|--|--|
|                              | (1)                                       | (2)            | (3)                   |  |  |
| Successful UPSTO application | 0.0659                                    | -0.0583        | -0.0494               |  |  |
|                              | (0.0461)                                  | (0.120)        | (0.0993)              |  |  |
| Log exports                  | $0.0119^{*}$                              | $0.0123^{*}$   | 0.00184               |  |  |
|                              | (0.00624)                                 | (0.00644)      | (0.00640)             |  |  |
| Export tenure                | -0.00871                                  | -0.00874       | -0.00460              |  |  |
|                              | (0.00654)                                 | (0.00664)      | (0.00637)             |  |  |
| HS2-year fixed effects       | Yes                                       | Yes            | Yes                   |  |  |
| Model                        | OLS                                       | 2SLS           | 2SLS                  |  |  |
| Sample                       | All applicants                            | All applicants | Continuing applicants |  |  |
| F-stat                       |   | 146.65         | 147.78                |  |  |
| Observations                 | 797                                       | 797            | 724                   |  |  |

Note: This table reports the estimated effect of a successful first U.S. patent application on a Chinese applicant's subsequent patent applications in China. The sample covers CCTS-ORBIS-PatEx matched exporters. Column 1 is estimated with OLS, while Columns 2 and 3 are estimated with 2SLS, using the demeaned examiner approval rate as an instrument. All columns include HS2 by application year pair fixed effects, and control for initial log exports and export tenure. Heteroskedasticity-consistent standard errors are clustered by examiner art unit. \*\*\* p < 0.01, \*\* p < 0.05, \* p < 0.1.