

U.S. Bill of Lading Data: Company Profiles Research Paper

Maritime & Trade, 2017

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Abstract

In this paper, we introduce the Maritime & Trade Bill of Lading data set and describe the collection methods and data validation process. Next, we present a single security and sector example to evaluate the value of using shipping volumes when forecasting corporate sales. Finally, we present an example long/short strategy that buys companies with increasing shipping volumes and shorts companies with decreasing volumes.

Maritime & Trade Overview

The Maritime & Trade division of IHS Markit includes four primary data assets, each with an extensive data history going back at least fifteen years. These data assets include Sea-Web's comprehensive ship and ownership data, a database of over 200,000+ ships and over 600 data points associated to each of those ships. Our AISLive's vessel tracking capability provides terrestrial and satellite ship movement intelligence of over 130,000 ships at any given moment in time. We have a Global Trade Atlas database that compiles official import and export statistics from sources around the world into a comprehensive database of merchandise trade. Lastly, our Bill of Lading data that includes transactional level details about waterborne trade for 17 countries. Each of these data assets is unique, comprehensive, and can potentially be applied to financial modeling.

The United States Bill of Lading data will be the focus of this research paper. With over 10 years of history and comprehensive coverage, IHS Markit provides the leading data solution for the global shipping industry.

United States Customs and Border Protection requires disclosure of shipment details for all vessels coming into or going out of US ports. IHS Markit captures this data and gathers additional data on-site at major US shipping ports. It employs a rigorous process to clean and validate the data to improve the timeliness, depth and accuracy of Bill of Lading data.

In an industry first, IHS Markit is providing Bill of Lading data in a normalized format that easily integrates with existing financial research systems by providing security identifiers for all of the companies in the M&T database.

While this data is typically used by participants in the global shipping industry, financial services companies are evaluating the data as a means to monitor the shipping activity of the companies they cover and to better understand shipping trends that may help them identify unforeseen risks and opportunities.

Long/Short Earnings Strategy

To demonstrate the value of M&T data for investment managers, we construct an example strategy that buys and sells companies based on the change in their quarterly shipping volumes. We propose a method for filtering the data and evaluated the signal performance each month, with a focus on companies reporting earnings.

We report strong performance with an average annual return of 11% for a long/short market-neutral strategy when using a combination of signals for both import and export activity.

Introduction to Maritime & Trade

US Import and Export Data Collection Overview

Maritime transport is crucial to the world's economy as over 90% of the world's trade is carried by sea and it is the most cost-effective way to move goods and raw materials around the world. The inception of the containerization system in 1956 facilitated international trade and globalization. Containers have standardized dimensions, and they can be loaded and unloaded, stacked, transported efficiently over long distances, and transferred from one mode of transport to another (container ships, rail transport flatcars, and semi-trailer trucks) without being opened. Goods that travel in containers can vary, such as cars, apparel, electronic goods, and refrigerated cargo such a meats and fruits.

Non-containerized vessels known as bulk carriers or tankers are specially designed to transport unpackaged bulk cargo, such as coal, cement, grains, and ore. Tankers are used to move large shipments of liquid cargo such as crude oil, liquid natural gas (LNG) and liquid petroleum gas (LPG). These vessels are designed to maximize capacity, safety, efficiency, and durability. Bulk vessels make up 15%-17% of the world's merchant fleets.

IHS Markit is the only data provider with access to a complete history of U.S. import and export waterborne trade data, including both containerized and non-containerized vessels. In 2016 we processed over 20 million bills of lading using our proprietary process to convert raw data into solutions that deliver decision ready intelligence. We are well versed in the efficient operation of data collection, standardization, collation, and dissemination because it has been an integral part of our Journal of Commerce (JOC) business unit since 1827.

Our US import data is sourced directly from US Customs and Border Protection (CBP) in a semi-automated fashion. Customs has an advanced filing system set up where major ocean carriers and third party logistics agencies electronically file their manifest information via EDI up to 72 hours before a vessel calls a US port. A data file is produced by CBP six days a week, and collected and ingested by our data operations team. The majority of the data on an import data file contains shipment information from 1-5 days prior to the current day. For example, a data file for June 10th 2017 will mostly contain import shipment information from June 6th through June 9th. An important point to note is that import data is made available in a linear fashion. For a given "data month" we anticipate having collected and processed all records in that month approximately 10 days after the end of the month. For example, our January 2017 import data is deemed "certified" by February 10th, 2017.

US Imports Data Collection Timeline

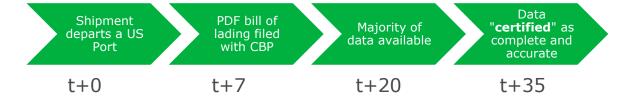


US export data is sourced via multiple means due to the manual nature of the filing process. Primarily data is made available through US Customs "Document Imaging System" (DIS) program. Customs requires major ocean carriers to file PDFs of bills of lading via email approximately 7-10 days after a vessel calls a port. CBP collects these PDFs and distributes them to data subscribers on a weekly basis in an XML file with PDFs embedded within the XML. IHS Markit extracts the PDFs from the XML, loads them through an Optical Character Recognition (OCR) process in order to create a data feed that is then ingested and stored in our database.

Secondarily, there is still bill of lading documentation that is filed manually via paper at over two dozen ports across the United States. IHS Markit has invested in a network of employees that are strategically placed at port locations across the US to collect this paper documentation. Our port employees will collect manifest information at each location on a daily, weekly, or monthly basis depending on the amount of volume at the port. The paperwork that is collected on-site is either scanned into our system or manually data entered into our propriety software application.

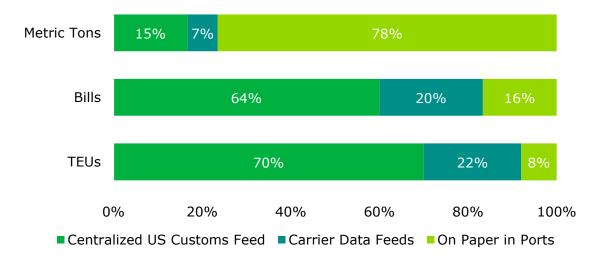
Lastly, we obtain weekly or monthly data feeds from many of the top ocean carriers who are also IHS Markit customers. Leveraging these data feeds allows us to process the data in a more timely fashion while minimizing the opportunity for error through the removal of manual intervention. For a given "data month" on US exports we anticipate having collected and processed all records in that month approximately 35 days after the end of the month. For example, our January 2017 export data is deemed "certified" by March 5th 2017. Although most of the data is available within 15-20 days after the end of the month we still travel to various locations and collect paperwork that is filed manually.

US Exports Data Collection Timeline



The chart below depicts the percentage of volume collected by method by looking at the data through bills of lading, metric tons (bulk shipments), and TEUs (twenty foot equivalent units – i.e. shipping containers).

US Export Data Sourcing



The IHS Markit team has several quality control procedures in place to ensure data quality. Various statistical forecasting and quality control measures are leveraged as independent checks on overall volume. Additional quality control models are used to validate shipment volumes by port, shipping line, and commodity. ARIMA modelling is used to forecast our expected shipment volume to ensure we're accounting for long-term trends, seasonality, and month to month variation. When analysing the data prior to certification, if the actual volume falls out of control limits set by our models it will prompt an investigation by our quality control team. We also work very closely with our customers, including many US Ports, top container carriers, and third party logistics agencies to verify the data on an on-going basis.

US Customs and Border Protection also have measures in place to ensure documentation is filed accurately with financial penalties in place as a deterrent for errant filing.

Description of the Actual Data

The base document that is filed and reported on is a bill of lading (BOL). Each bill of lading contains approximately twenty primary data fields and will include but not limited to:

- Bill of Lading Number
- U.S. Consignee Name and Address
- Foreign Supplier Name and Address
- Notify Party Name and Address (Two Notify Party fields per import BOL)
- Transportation Companies involved in transaction
- Cargo/Commodities being shipped
- US Port of Loading (Import/Export)
- Foreign Port and Country of Discharge (cargo coming from or going to)
- Date of import/export
- Vessel Name

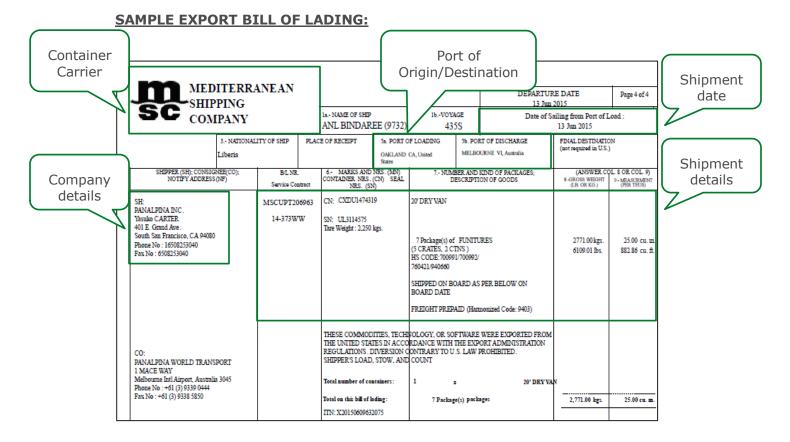
US import documentation includes the filing of two types of documentation, "House" bills of lading and "Master" bills of lading. The filing of the two types of documentation provides greater insight into the parties involved in the transaction. Key information about each type of documentation includes:

- Master Bill of Lading: cargo receipt filed by the ocean carrier and will include the
 parties in the transaction including a third party logistics agency if one is
 involved in the shipment. This documentation is filed by the ocean carrier on
 behalf of the shipper or third party logistics agency (their customer).
- House Bill of Lading: cargo receipt filed by the third party logistics agency on behalf of the primary party involved in the transaction (shipper).

Understanding the two types of documentation is relevant because it allows users of the data to discern the relationship between the shipper of the cargo, the third party logistics agency involved (if applicable), and the ocean carrier involved in shipping the cargo.

US export documentation **only consists of master bills of lading**. Third party logistics agencies are not required to file house bills of lading at this time. This is important to note because if a third party logistics agency is involved in the transaction they will show up as the US shipper and not the actual shipper on the bill of lading. The US shipper will be on the bill of lading documentation for approximately 75% of transactions (25% of the transactions will have the third party logistics agency).

The US bill of lading data set consists of over 100 data points, including data as filed on the bill of lading and additional value added fields derived or calculated by our data processing system.



Description of the Key Data Fields

Company Name:

• This field is the standardized company name that is filed in any "party" field on a bill of lading. It is the sum of volume for that entity regardless of if they are the U.S. Consignee, Foreign Shipper, Notify Party #1 or Notify Party #2.

TEU's (Twenty Foot Equivalent Units):

 This is a common transportation industry measurement for the number of containers that are being shipped. Containers can be various sizes including 20 foot, 40 foot, 53 foot, etc. The TEU field is a calculated field that is determined based on the number of containers and their length as filed on the bill of lading. For example, a 40 foot container would be considering 2 TEUs.

Metric Tons:

A unit of mass equal to 1,000 kilograms (2,205 lbs).

Shipments:

• This field is a count of distinct bills of lading filed by a particular entity.

CUSIP Number (Committee of Uniform Securities Identification Procedures):

 The CUSIP number consists of a combination of nine characters, both letters, and numbers, which act as a unique identifier for the type of security issued by a company. The first six characters identify the issuer and are assigned in an alphabetical fashion; the seventh and eighth characters (which can be alphabetical or numerical) identify the type of issue, and the last digit is used as a check digit.

ISIN Number (International Securities Identification Number):

• This number uniquely identifies a security. Its structure is defined in ISO 6166. Securities for which ISINs are issued include bonds, commercial paper, stocks, and warrants.

Description of Company Name Consolidation Process

There are several opportunities for a company name to appear on the documentation used in the maritime import/export filing process. A company can appear as the US Consignee (US buyer), Foreign Supplier (imports only), Notify Party #1, and Notify Party #2. The documentation process is often decentralized for an organization that is performing the filing, which leads to a significant amount of variation in company names that show up on a bill of lading. Measures have been put in place during inline data processing to account for name variation. However unaccounted for, new variants can enter or company name reference data on a daily basis. There are 2.2 million different company names per year in the source data; although we estimate less than 200,000 U.S. companies are trading outside North America.

Our reference data consolidation process plays an integral role in providing clear and concise data to our customers. There are three primary steps that take place during this process:

- 1) Company name cleansing
 - a. Elimination of duplicate names
 - b. Use regex to remove excess info (email addresses, phone numbers, legal terms, extraneous words, etc.)
 - c. Standardization of common terms
- 2) Name grouping based on similarity
 - a. Programmatically score names and measure the similarity between each pair of names that are scored based on the number of words they have in common
 - b. Focus on "high quality matches" that exceed a determined quality threshold
 - c. "Clusters" of the company names are then grouped together using the statistical programming language 'R'.
- 3) Determine the group's display name
 - a. Choosing the representative name in the group that has appeared the most frequently over the last five years of data

The reference data consolidation process is mostly automated through a machine learning algorithm but manual intervention is needed for additional validation of selected names and removal of false positives.

Once our reference data has been standardized to display a single variation of an entity name we cross reference that data with Russell 3000 list. For the resulting matches we add additional financial data points such as CUSIP, ISIN, Industry, Sector, etc.

Description of Restricted Data

US Customs and Border Protection allows for shippers of cargo to participate in a "Restricted Parties" program. If a shipper fills out the appropriate documentation and is approved by US Customs their company name and address will be redacted from information that is published by Customs. All other information on the bill of lading will be made available, except for the company name and address information. In the place of the company name Customs will redact the information using the term "ORDER". A company can begin participating in this program at any time and their participation in the program will be accepted for a period of 24 months. If the company does not reapply for restricted status by the end of the term, their information will be made available in import/export data once the 24 month term is up.

*Note: data subscribers are not allowed to disclose the names of entities on the restricted parties list as per U.S. Customs regulations.

Imports vs. Exports

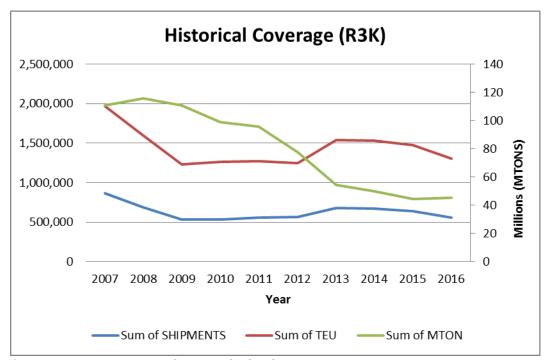
There are two primary reasons to note the difference between import data and export data:

- 1) The level of transparency into the parties involved in the transaction (as previously noted). Access to both "house" and "master" bills of lading provide more information regarding the parties involved in the transaction whether they be the US shipper, foreign supplier, financial institution involved, etc. Also important to note, due to US government regulations export documentation only includes the US exporter and not the party receiving the cargo. On US imports we have access to both foreign supplier and US buyer.
- 2) US import data are more current than export data due to the nature of the filing process. Documentation for imports is required to be filed prior to calling the port where, for exports, the documentation can be filed after the export occurs. Import documentation is also filed via EDI where export bills of lading are still mostly filed via emailed PDF or physically on-site at the port location and need to be collected manually.

Data Coverage

The table below outlines the percentage of coverage for the Russell 3000. The matches include companies that have physically shipped cargo in or out of the United States within the past 10 years.

	% Russell 3000
Total Matches	43%
Matches with over 50 Shipments	24%
Matches with over 100 Shipments	23%



*Note: MTONs on secondary vertical axis

Description of 2013 Automation Change

Starting in Q3 2013 the business rolled out a mostly automated system to ingest and process all data. This is important to note for a few reasons, primarily because it removed the reliance on manual intervention when processing the data, improving data quality. For example, a quality check was put in place to account for weights that were filed incorrectly on bill of lading documentation. Additional reference data is now used that leverages the dead weight tonnage of a vessel to cap any weight filed that may exceed that limit. Improved quality checks such as this have led to less volatility in data output.

Sector coverage

The data table below depicts the shipment volume for the Russell 3000 by sector ranked by most shipments. Additional columns outline the percentage of overall volume for each sector and how much of that sector has an entity of the US Customs "Restricted Parties List".

SECTOR	Total Shipments	Sector % of Volume	% of Sector Restricted
Consumer Services	1,762,719	27.29%	75.1%
Capital Goods	1,143,620	17.70%	51.6%
Consumer Non-Durables	1,120,228	17.34%	18.4%
Basic Industries	1,021,439	15.81%	55.0%
Consumer Durables	512,179	7.93%	58.0%
Energy	238,867	3.70%	44.2%
Health Care	238,684	3.69%	55.9%
Transportation	132,893	2.06%	1.2%
Technology	120,905	1.87%	28.0%
Finance	84,771	1.31%	24.9%
Miscellaneous	54,976	0.85%	93.4%
Public Utilities	27,605	0.43%	48.2%
Utilities	810	0.01%	0.0%
Services	62	0.00%	0.0%
Healthcare	5	0.00%	0.0%
Grand Total	6,460,335	100%	51.7%

Sample Report

Below is a sample report that outlines aggregated TEU volume from 2016 over a weekly time series. The complete report includes volume from 2007 to date and includes additional fields such as industry, sector, metric tons, and shipments.

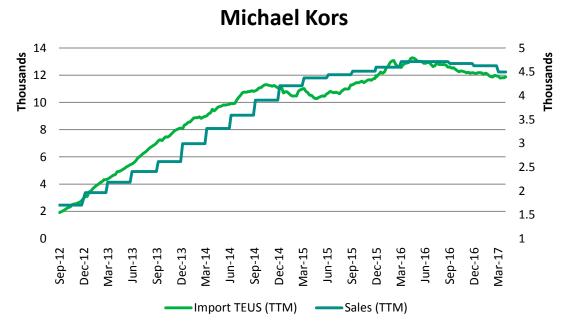
COMPANY SHIPMENT VOLUME - TEU'S BY WEEK											
								2016			
	IHS MARKIT										
COMPANY	TICKER	EXCHANGE	CUSIP	ISIN	W1	W2	W3	W4	W5	W6	W7
PROCTER & GAMBLE CO	PG	NYSE	742718109	US7427181091	856	707	656	601	734	748	629
GENERAL MOTORS CO	GENMC	NYSE	37045V100	US37045V1008	532	668	677	526	565	574	833
TYSON FOODS INC	TSN	NYSE	902494103	US9024941034	896	824	887	724	984	850	818
PRICESMART INC	PRICEIN	NASDAQ	741511109	US7415111092	795	675	632	673	699	642	559
C H ROBINSON WORLDWIDE	CHRW	NASDAQ	12541W209	US12541W2098	912	885	843	876	996	939	1,012
ARCHER DANIELS MIDLAND	ADM	NYSE	39483102	US0394831020	838	904	1,023	624	1,934	1,531	1,468
FORD MOTOR CO	F	NYSE	345370860	US3453708600	994	684	593	696	779	854	801
PIER 1 IMPORTS INC	PIERIMP	NYSE	720279108	US7202791080	278	50	154	192	102	190	159
UNDER ARMOUR CLASS A	UARM	NYSE	904311206	US9043112062	596	704	368	321	347	308	441
PILGRIMS PRIDE CORP	CHX	NASDAQ	72147K108	US72147K1088	215	305	306	188	287	277	235
MICHAEL KORS HLDGS LTD	MICHKOR	NYSE	G60754101	VGG607541015	207	249	253	436	289	331	281
DELTA APPAREL INC	DELTAPP	AMEX	247368103	US2473681037	100	119	143	127	177	156	150
HARLEY DAVIDSON INC	HDI	NYSE	412822108	US4128221086	90	119	201	121	91	193	187

Sales Forecasting

Using import and export data can lead to better earnings forecasts. Using weekly data, we analyzed the correlation of trailing twelve month import activity measured in twenty-foot equivalent units (TEUS) representing the number of containers imported to US ports. We show examples for both a single security as well as a sector. For each example, we lag the import data by 10 days to adjust for any look-ahead bias in the historical data.

Single Security example

Each company has a unique supply chain and sales distribution network. In some instances, imports lag sales while in others, they tend to lead them. In the example below, we show the correlation of the trailing twelve month imports and the trailing twelve month reported sales numbers for a clothing and accessory retailer:

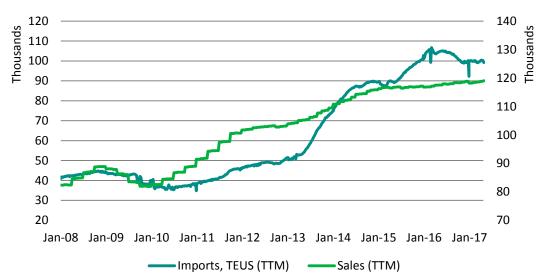


This is a strong example of a situation where having frequent access to import activity would be highly relevant to tracking the company's sales activity in higher frequency than available from quarterly reports. This could be used as an early indicator of potential risks to the business, or as a check against corporate guidance and sell-side estimates.

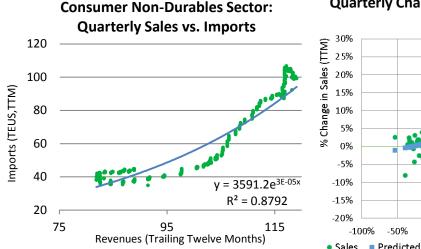
Sector Example

While information on a single security is helpful, we also analyzed the information at the sector level. Here, we took the sum of the trailing twelve month sales figures for the top 20 Consumer Non-Durable companies that demonstrated the highest overall coverage in import data for the past ten years. We noted a correlation of 0.92 between the import data and the sales data for the twenty companies analyzed. The results are shown in the next chart:





Next, we produced a scatter plot of the above data set and analyzed the relationship to demonstrate the predictive value of the import data when forecasting sales. Again, we used the trailing twelve month import data and trailing twelve month reported sales data. The chart suggested a strong relationship between the two datasets. We use an exponential curve to fit the estimates with an R² of 0.88. We also looked at the percent change in quarterly sales for each of the companies relative to percent changes in imports. This showed a positive relationship with higher import activity generally leading to higher sales activity and vice versa. We suggest additional information including changes in CPI, PMI and consumer sentiment could be used to construct a more robust quarterly sales forecasting model:



Quarterly Change in Sales vs. Imports



Finally, we noted that while data coverage is a good criterion for determining if shipping activity would be a good predictor of future earnings, we suggest running a regression for each company and using the results to better determine which companies have historically shown a strong relationship with shipping activity. Focusing on these companies should produce the strongest risk/return profile.

Long/Short Earnings Strategy

Strategy Description

The predictive value in forecasting earnings was described in the previous section. In this section, we construct a strategy that buys shares of companies with increasing shipping activity and shorts the stock of companies with decreasing shipping activity. We then compared the results of our longs and shorts each month.

To identify companies with the largest changes in shipping activity, we rank securities each month using the change in quarterly imports and exports using the TEUS measurement (twenty foot equivalent units, a standard measure for a container) and the shipping volumes as measured by the number of bills.

To avoid look-ahead bias, we lag the import data by 10 days and the export data by 35 days to account for the longer time it takes to certify export data due to the manual process of collecting and analysing bill information.

The paper uses the current members of the Russell 3000 and will therefore suffer from survivorship bias as additional work is needed to map delisted and merged securities to the Maritime & Trade database. This will lead to outperformance of the universe relative to an historical benchmark. However, the difference in annual returns between the long and short portfolios will provide insight into the relative performance of companies with increasing shipping activity compared to decreasing.

Calculating trailing twelve month growth rates

To adjust for seasonality in the data, we compute a trailing twelve month measurement of shipping activity and calculate a quarterly growth rate each month. We limit the analysis to companies with at least 15 months of trailing activity.

Computing trailing twelve month growth for each quarter:

January to December shipping activity

April to March shipping activity

This approach was used both for its simplicity and to smooth out volatility in the data that may be observed when calculating year-over-year growth (Q1 this year compared to Q1 in the prior year, for example). Other sophisticated statistical procedures may be useful to identify or adjust for seasonality in the data, but this approach is easy to replicate and achieves the goal of comparing the growth in shipping activity on a quarter by quarter basis.

Filtering the data

While some data sources may be useful for evaluating all listed companies (for example, P/E ratio or price momentum), shipping activity will be most useful for companies that have significant shipping activity and operate in sectors where shipping activity may be a good indicator of a company's overall economic activity.

To focus the research on companies most likely to produce strong investment signals from shipping activity, we exclude companies in the Finance and Private Utilities sectors.

When evaluating the import data, we also limit the analysis to companies with an average of 75 shipments per quarter for the prior 4 quarters. This focused the research on larger companies that are likely to be more liquid, and also removed companies with inconsistent shipping activity.

Due to the lower export activity, we decreased the minimum shipping requirement to 25 shipments per quarter for the prior 4 quarters. We noted strong performance generally in the export data due to the difficulty in acquiring accurate and complete data. This is one of the advantages of the IHS Markit Maritime & Trade data, as their process involves a number of quality checks and manual processes to increase both the accuracy and coverage of available data.

The filtered universe yielded approximately 150-200 companies per quarter and approximately 30-40 longs and shorts each quarter. Alternative filtering approaches including using information from public filings or using historical correlations between shipping activity and earnings may increase overall coverage and returns. For the purpose of this paper, we sought to establish a base case that was easy for clients to replicate by using the minimum number of shipments each quarter.

Limiting the universe by the number of shipments should also decrease the number of restricted companies that are included in the analysis. Additional work needs to be done to fully remove these effects, however, and researchers should be aware of this.

Finally, we limited the analysis period from 2010 to 2017 using trailing data from Q4 2008 onwards. While the data is available from 2007, we wanted to limit any bias introduced from activity in prior economic regimes including the global financial crisis. Performance during the crisis was positive in general, but introduced additional volatility. Limiting the timeframe also limited some of the survivorship bias that would have been introduced in 2008.

Focusing on Earnings

Next, we limit the analysis to companies reporting earnings in the current month. We use the lagged data that would have been available at the beginning of the month and assume a holding period of one month and include any dividends received. Unlike a traditional quantitative strategy, this approach only trades when a company is expected to report earnings in the current month. This limits the number of companies in each portfolio (quintile) in any given month.

The returns may also be stronger for more nimble traders who trade mid-month and are able to optimize the timing for the maximum amount of data available prior to earnings.

However, for easier comparison of returns, we assume all trades occurred at the beginning of the month using the data that would have been certified at that time (10 day lag for imports, 35 day lag for exports).

Calculating Monthly Quintile Ranks

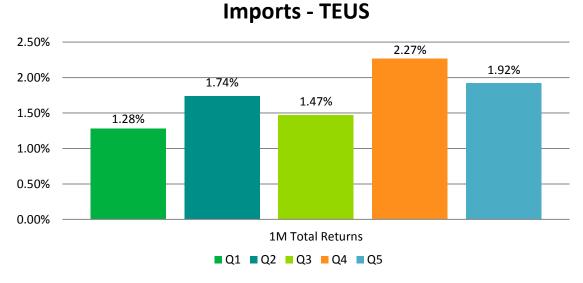
At the beginning of each month, companies reporting earnings in the current month were ranked from 1-100 using either the number of containers imported over the quarter (TEUS) or the number of shipments exported. These percentile ranks are then converted into quintiles (ranks 1-5) ranked by the change in shipping activity as measured by the trailing twelve month activity at the beginning of the month compared to the trailing twelve month activity calculated in the previous quarter.

An additional average shipping activity rank was constructed to increase coverage as well as provide signals from both import and export activity. This was calculated as the simple average percentile rank of both the import and export signals to create a new percentile rank that was then bucketed into quintiles (ranks 1-5).

The top 20% of companies are ranked 5, while the worst 20% of companies as measured by the change in shipping activity are ranked 1. If a company was not reporting earnings in the current month or did not meet the minimum shipping requirements (average 75 shipments per quarter for imports), the company was not given a rank in that month.

Quintile Performance

Monthly Performance by Quintile, Jan 2010 to April 2017:



The top ranked quintile (Q5) produced an average monthly return of 2%. This was in contrast to the worst ranked quintile (Q1) that produced an average monthly return of 1.3%. This suggests that companies with increasing quarterly shipping volumes tended to outperform companies with decreasing shipping volumes during the month when they reported earnings.

Monthly Performance by Quintile, Jan 2010 to April 2017:

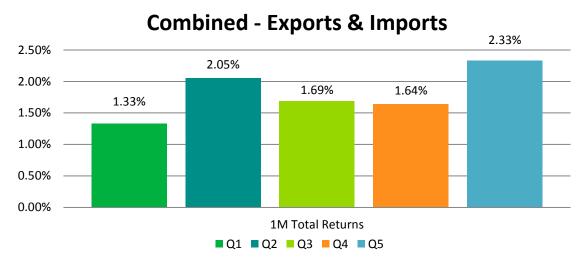


We note similar performance for the export data with the first quintile generally underperforming the last quintile, showing the average outperformance of companies with increasing quarterly shipping activity and the relative underperformance of companies with decreasing shipping activity.

Import/Export Composite Signal

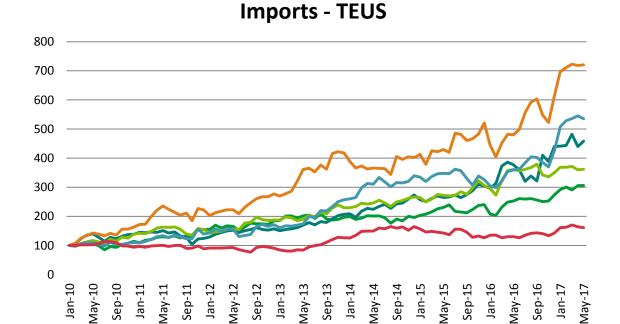
Next, we combine the import and export ranks to create an average rank. The correlation of the ranks for the two datasets was approximately 0.70, and there was generally more import data available than export. This approach improved both overall returns and coverage:

Monthly Performance by Quintile, Jan 2010 to April 2017:



The top quintile outperformed the bottom quintile by 100 bps per month for the companies analyzed. As will be seen in the next section, this resulted in strong performance for the long/short market-neutral strategy.

Performance by Month



Quintile	1	2	3	4	5	L/S (Q5-Q1)
GeoMean	1.28%	1.74%	1.47%	2.27%	1.92%	0.54%
CAGR	16.48%	23.06%	19.16%	30.91%	25.70%	6.71%
StDev	0.20	0.24	0.20	0.25	0.24	0.20
IR	0.83	0.97	0.98	1.22	1.09	0.33
Max Down	-13.89%	-18.83%	-10.89%	-14.72%	-16.32%	-12.28%

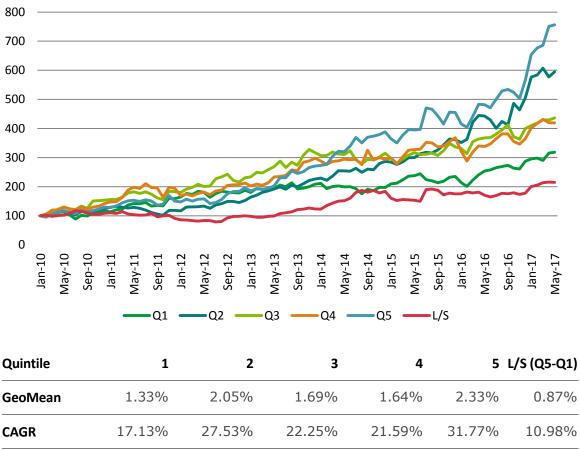
Q1 — Q2 — Q3 — Q4 — Q5 — L/S

The import data was very informative, and produced an average long/short return of nearly 7% per year. The lowest ranked stocks (Q1) significantly underperformed all of the other stocks, demonstrating the value of import activity when forecasting onemonth forward returns.

Export - Shipments 800 700 600 500 400 300 200 100 Sep-13 Sep-14 Q1 — Q2 — Q3 — Q4 — Q5 — Quintile 2 3 5 L/S (Q5-Q1) 1 1.57% 1.93% 2.10% 1.21% 2.28% 0.56% GeoMean **CAGR** 20.58% 25.77% 28.33% 15.48% 31.12% 6.91% 0.20 0.21 0.24 0.23 0.25 0.25 **StDev** IR 1.02 1.23 1.21 0.68 1.24 0.28 -9.86% **Max Down** -13.01% -20.64% -18.25% -13.59% -13.88%

Similar to the import data, the export data produced strong performance for the top ranked stocks and demonstrated underperformance for the lower ranked stocks. The long/short returns were higher, with an average annual return of 7%, but with slightly higher volatility than the import data.

Combined - Imports & Exports



GeoMean	1.33%	2.05%	1.69%	1.64%	2.33%	0.87%
CAGR	17.13%	27.53%	22.25%	21.59%	31.77%	10.98%
StDev	0.20	0.19	0.21	0.23	0.22	0.19
IR	0.85	1.49	1.08	0.95	1.48	0.57
Max Down	-13.89%	-7.39%	-9.79%	-16.49%	-10.95%	-12.67%

The combined strategy produced the strongest returns, with an average return of 11% for the long/short portfolio produced with relatively low volatility in returns resulting in an information ratio of 0.57. This approach was the most robust, as it included information from both the import and export data.

Conclusion

In this paper, we introduced the Maritime & Trade data and described the data fields available, collection method, historical data and how the data has been mapped to individual securities.

Next, we analyzed the import data and demonstrated how the data may be used to improve earnings forecasts. We then created an aggregate metric for the Consumer Non-Durables sector and noted the strong correlation with trailing twelve month corporate sales.

Finally, we evaluated the performance of a long/short investment strategy that bought shares of companies with increasing quarterly shipments and shorted companies with decreasing shipping activity. We then combined data from both imports and exports data to produce a new composite shipping signal.

- The strategy produced an average annual return for a long/short market-neutral strategy of 11% with an information ratio of 0.57 (returns/volatility).
- We suggested areas for future research including constructing security-specific company earnings models using the Maritime & Trade data, mapping the historical data to delisted or merged securities to avoid survivorship bias and developing algorithms to exclude companies from the analysis where data is likely restricted.

Appendix

Top Securities for Q1 2017 (February – April)

Long Portfolio (Q5):

Company	Quintile 5 (top)	1M Total Return
ACUITY BRANDS INC	5	-13.61
ADVANCE AUTO PARTS INC	5	-4.55
AES CORP	5	1.58
ALLISON TRANSMISSION	5	2.59
BAKER HUGHES INC	5	-0.75
BOISE CASCADE COMPANY	5	10.87
CABOT MICROELECTRONICS	5	2.27
CHILDRENS PLACE INC	5	20.05
CONSTELLATION BRANDS	5	6.46
DARLING INGREDIENTS INC	5	15.73
DOLLAR GENERAL CORP	5	-4.64
DOMTAR CORPORATION	5	-12.66
ENPRO INDUSTRIES INC	5	-3.27
FERRO CORP	5	10.14
ICU MEDICAL INC	5	6.75
ILLINOIS TOOL WORKS INC	5	4.24
INTERFACE INC	5	7.29
INTL FLAVORS & FRAGRANCE	5	6.06
INVENTURE FOODS INC	5	-16.76
JAKKS PACIFIC INC	5	4.90

KROGER CO	5	-12.55
MARTIN MARIETTA MTLS	5	-5.54
MEAD JOHNSON NUTRITION	5	-0.40
MOHAWK INDUSTRIES INC	5	2.31
PARKER HANNIFIN CORP	5	0.30
PILGRIMS PRIDE CORP	5	7.88
RESTORATION HARDWARE	5	48.27
SANMINA CORPORATION	5	-8.25
SKECHERS USA INC	5	-8.01
SUPERVALU INC	5	6.22
TARGET CORP	5	-9.10
THERMO FISHER SCIENTIFIC	5	7.64
TJX COMPANIES INC	5	0.33
TRACTOR SUPPLY CO	5	-10.24
XPO LOGISTICS INC	5	12.48

Short Portfolio (Q1):

Quintile 1 (bottom)	1M Total Return
1	1.90
1	21.87
1	3.24
1	-24.35
1	1.94
1	11.31
1	-24.26
1	-12.65
1	18.21
1	6.20
1	-1.30
1	-0.44
1	-16.47
1	-0.17
1	5.22
1	-2.13
1	3.91
1	11.40
1	-0.87
1	2.22
1	2.50
1	-1.89
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OIL DRI CORP OF AMERICA	1	8.79
ROSS STORES INC	1	1.68
SCHLUMBERGER LTD	1	-7.06
SCHNITZER STEEL INDUSTRIES	1	-8.47
SONOCO PRODUCTS CO	1	-1.30
STANLEY BLACK & DECKER	1	2.47
STARBUCKS CORP	1	2.86
TESLA MOTORS INC	1	0.10
WHIRLPOOL CORP	1	8.38
WILLIAMS SONOMA INC	1	6.52

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