

Estimation of Marine Emissions Inventory from all AIS-installed Vessels

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Introduction

Research Questions

Methodology

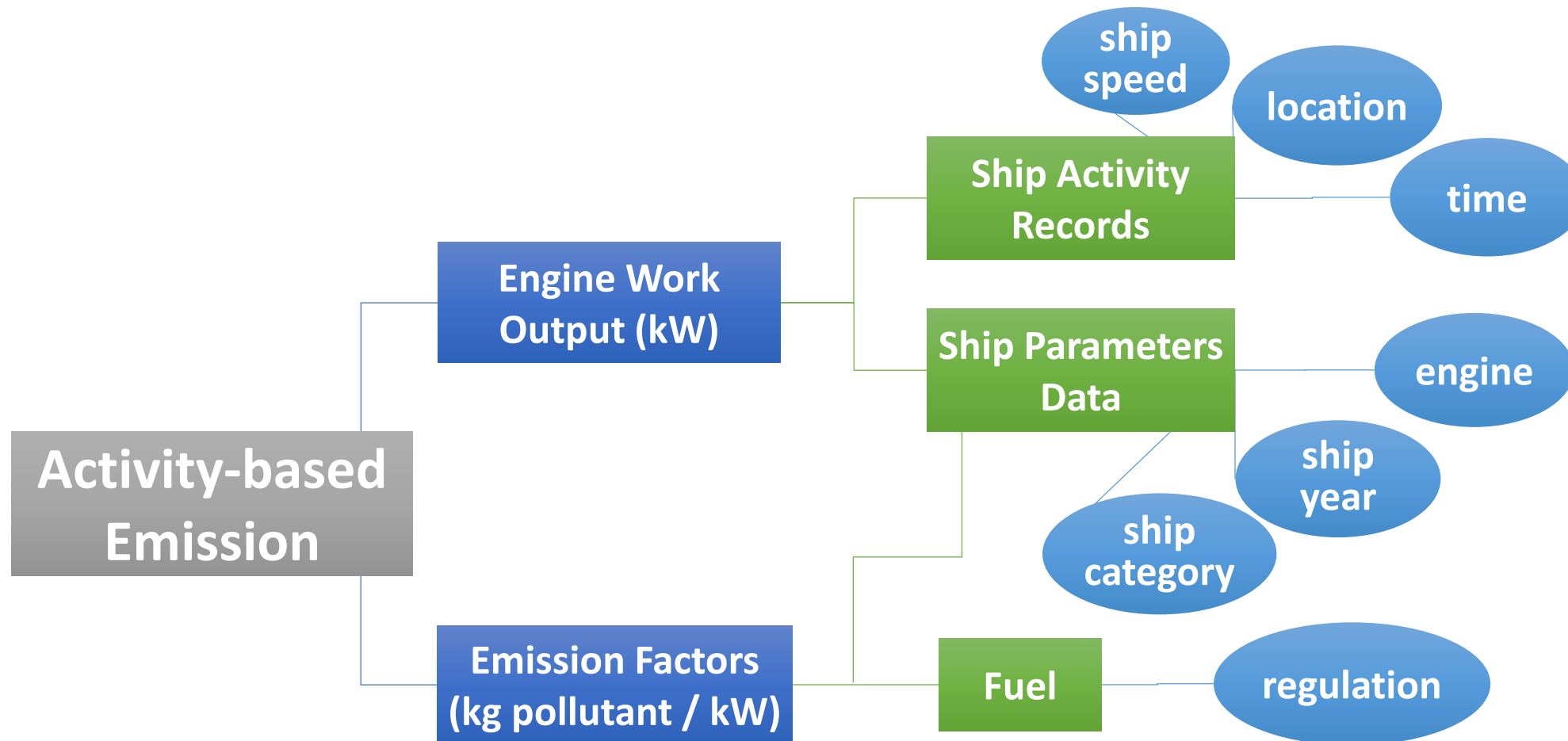
Result

Summary

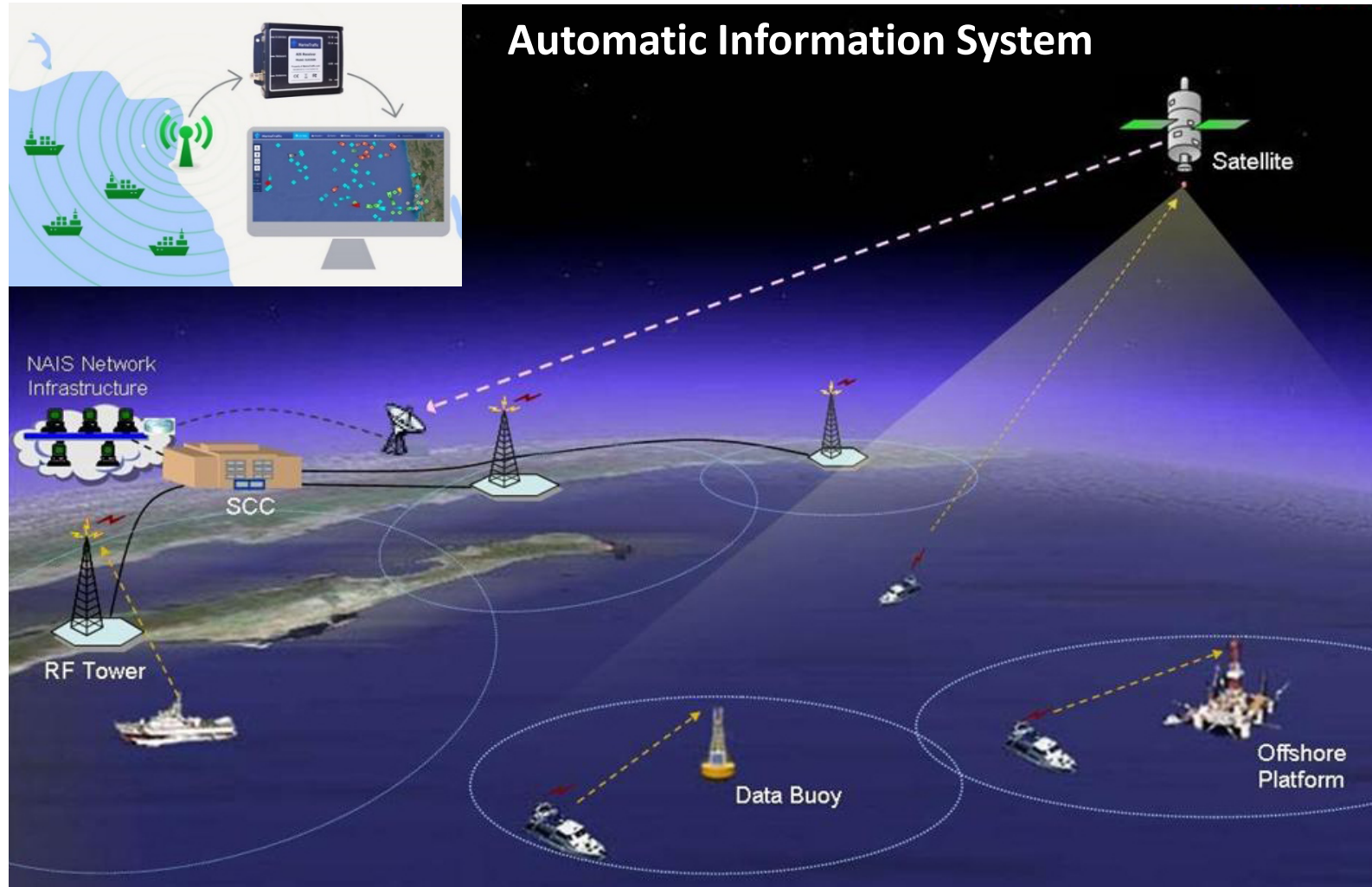
What is Marine Emission?



$$\text{Emission} = \text{Engine Work Output} \times \text{Emission Factor}$$



Advancement of Ship Activity Data



Ship Parameter Data

- ❖ **World Register of Ships Database**
 - global database, vessels with IMO number
- ❖ **Ship Classification Societies**
- ❖ **Local Administration Records**
- ❖ **Commercial Databases**



Parameter Category	Ship Activity Data (AIS Database)	Ship Parameter Data (World Register of Ships Database)
Vessel Identity	IMO Number	IMO Number
	MMSI	MMSI
	Ship Name	Ship Name
	Call Sign	Call Sign
Vessel Type	--	Statcode5 (industry-standard ship type code)
	Ship Type (AIS-based)	--
Vessel Size	Length, Beam	Length, Beam
	--	GT, DWT, TEU
Engine-related Parameter	--	Engine Power, Engine Speed
	--	Ship Maximum Speed
	Real-time Speed	--
Spatial Info	Longitude, Latitude	--
Temporal Info	Date time	--

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AIS-based Estimation

➤ Ship Activity Data – AIS Records

➤ Ship Technical Parameters

Identified by IMO number or MMSI

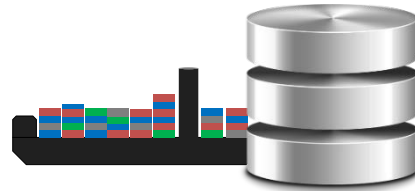
Problem: AIS records **could NOT be identified** in Ship Parameter Database?

➤ Your available ship parameter database do not cover all the vessels with AIS records, such as some domestic vessels

Could we estimate marine emissions from all vessels with AIS records?

800+ million Activity Records

190,000+ Ships Parameters



AIS Activity Data

- IMO
- MMSI
- Ship Name
- Call Sign
- AIS Ship Type
- Length
- Latitude
- Longitude
- Movement Date Time
- Speed

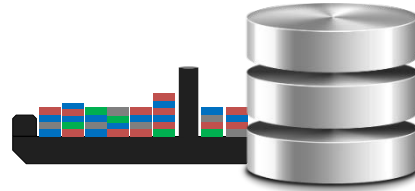
**Ship
Identification**

**Identified
Ship**

Ship Parameters

- IMO
- MMSI
- Ship Name
- Call Sign
- Statcode5
- Length
- GT, DWT, TEU
- Ship Maximum Speed
- Engine Power
- Engine Speed
- Ship Construction Year

800+ million Activity Records **190,000+ Ships Parameters**



AIS Activity Data

- IMO
- MMSI
- Ship Name
- Call Sign
- **AIS-based Ship Type**
- **Length**
- Latitude
- Longitude
- Movement Date Time
- Speed

Ship Identification

Identified Ship

Ship Parameters

- IMO
- MMSI
- Ship Name
- Call Sign
- Statcode5
- Length
- **GT, DWT, TEU**
- **Ship Maximum Speed**
- **Engine Power**
- **Engine Speed**



Ship Type – Length Range
Ship Parameters

Quantile
Median



Group Statistics

- AIS-based Ship Type
- Length Range
- Ship Max. Speed
- Engine Power
- Engine Speed

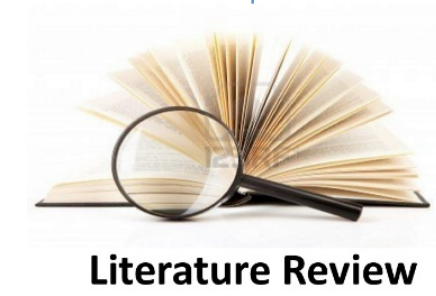
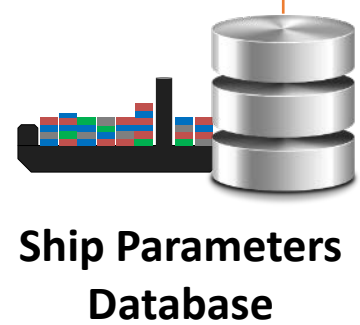
Key Assumptions

- The AIS records of ***Identified Vessels*** could be linked to the available ship parameter database by matching the IMO number or MMSI in both datasets
- The AIS records of ***Unidentified Vessels*** could be assigned the parameters values by matching their AIS Ship Type and Length Range

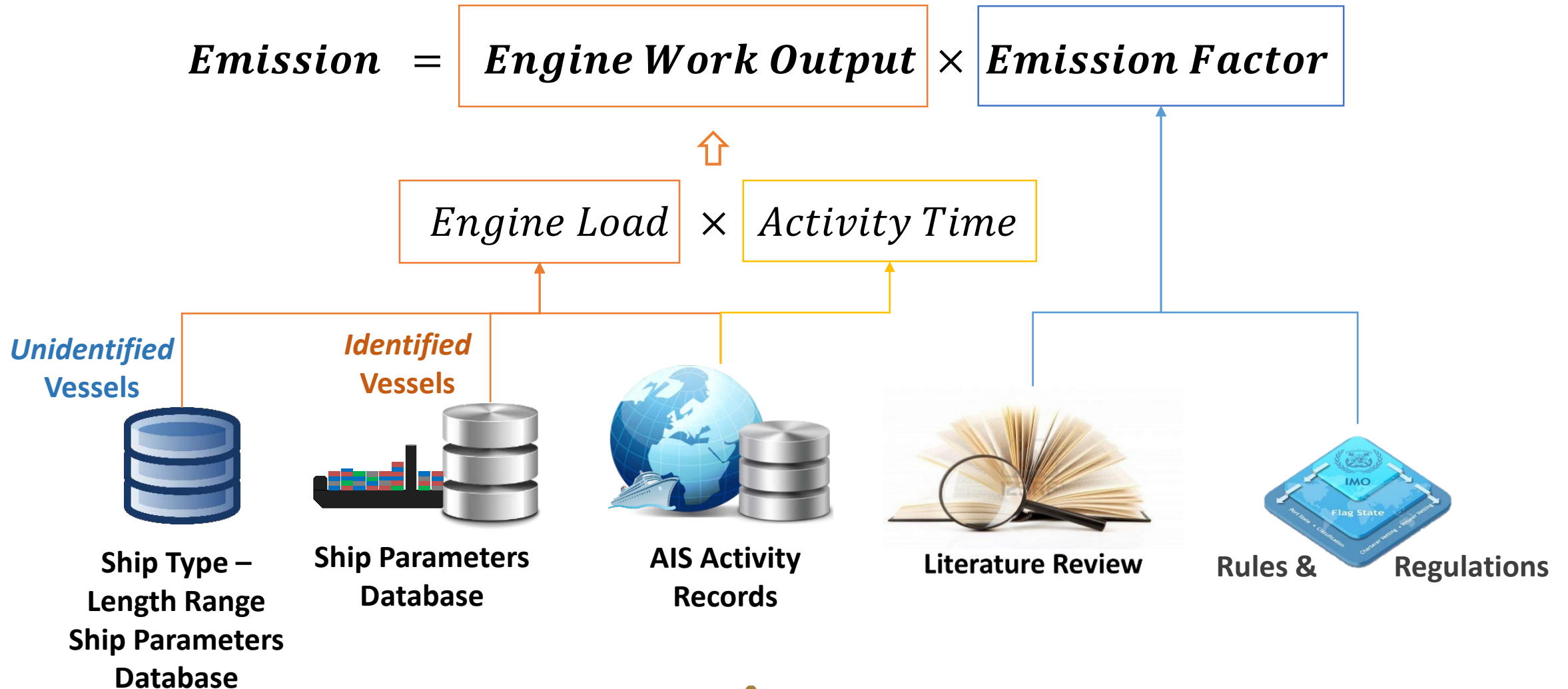
How to estimate marine emission inventory?

$$Emission = Engine\ Work\ Output \times Emission\ Factor$$

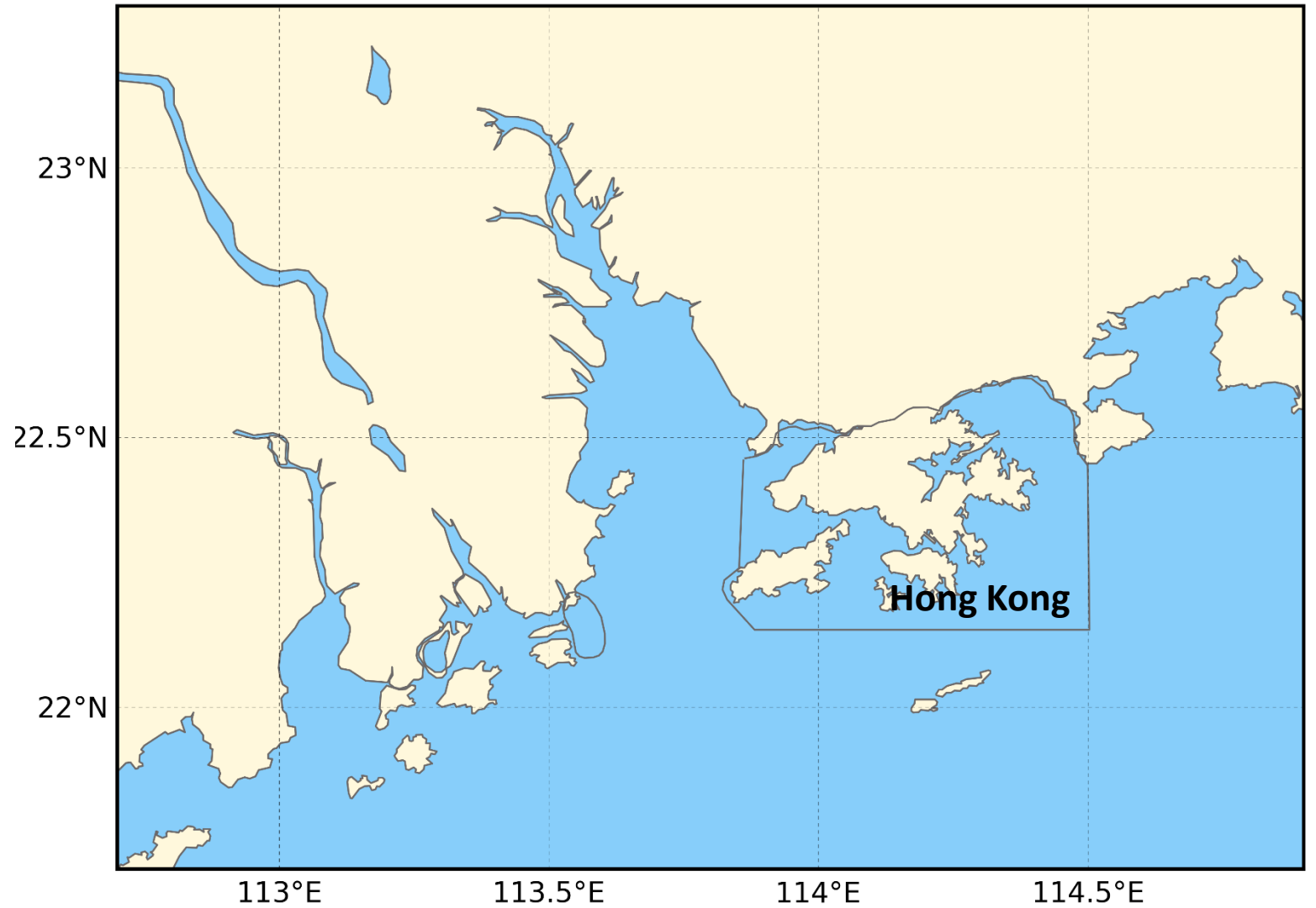
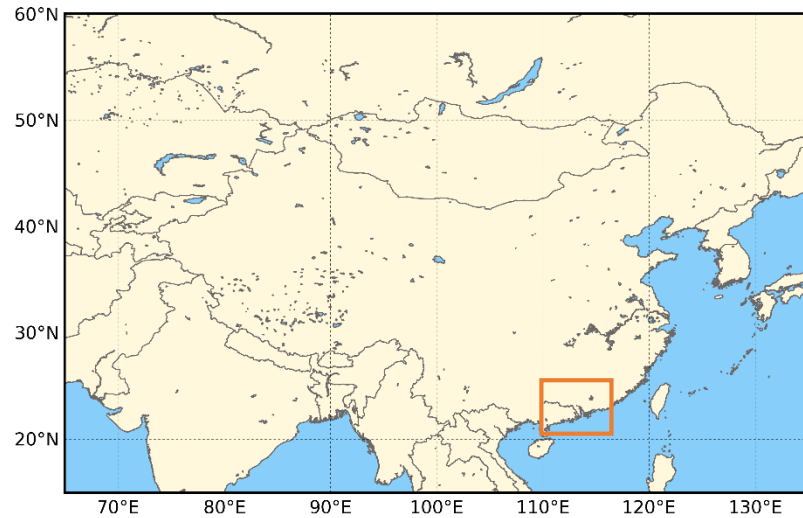
$$Engine\ Load \times Activity\ Time$$



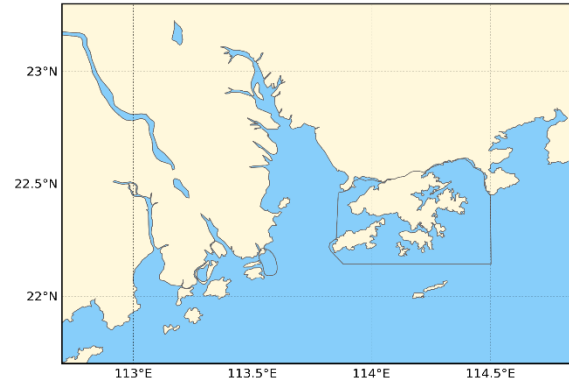
How to estimate marine emission inventory?



Case Study: Pearl River Delta, China

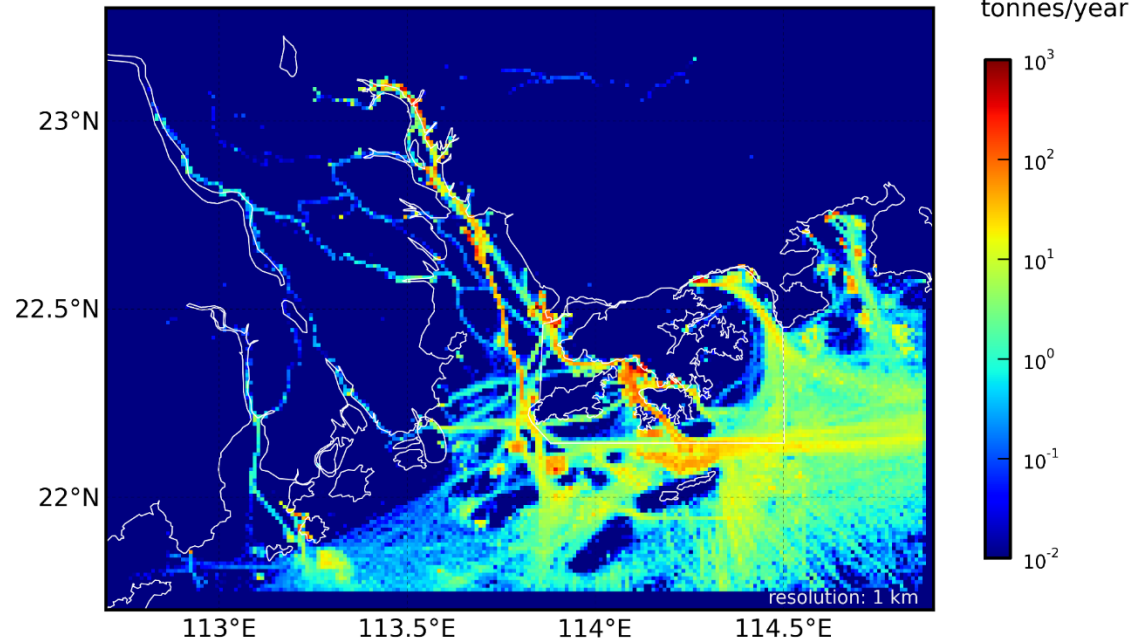


Case Study: Pearl River Delta, China

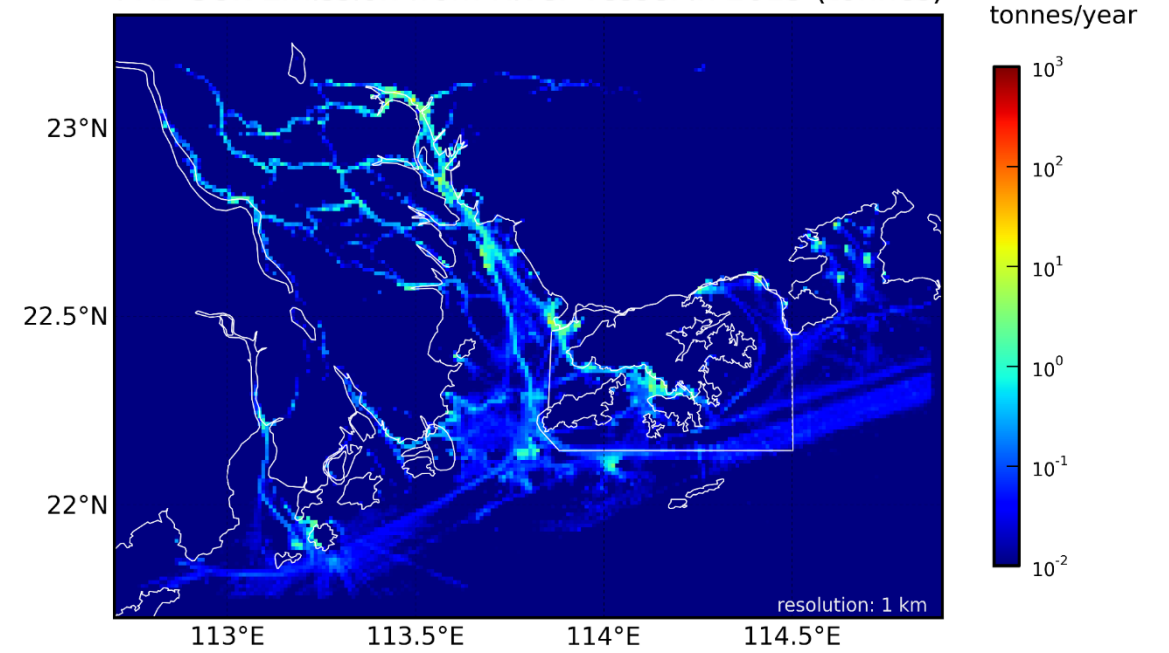


Identified?	Ship Category	Definition	Fuel (S%)
Identified	Ocean-going Vessels	Identified vessels that AIS Ship Type is NOT High Speed Craft	2.7%
Identified	High Speed Craft (Regional Ferries)	Identified vessels that AIS Ship Type is High Speed Craft	0.04%
Unidentified	River Vessels	All unidentified vessels	0.04%

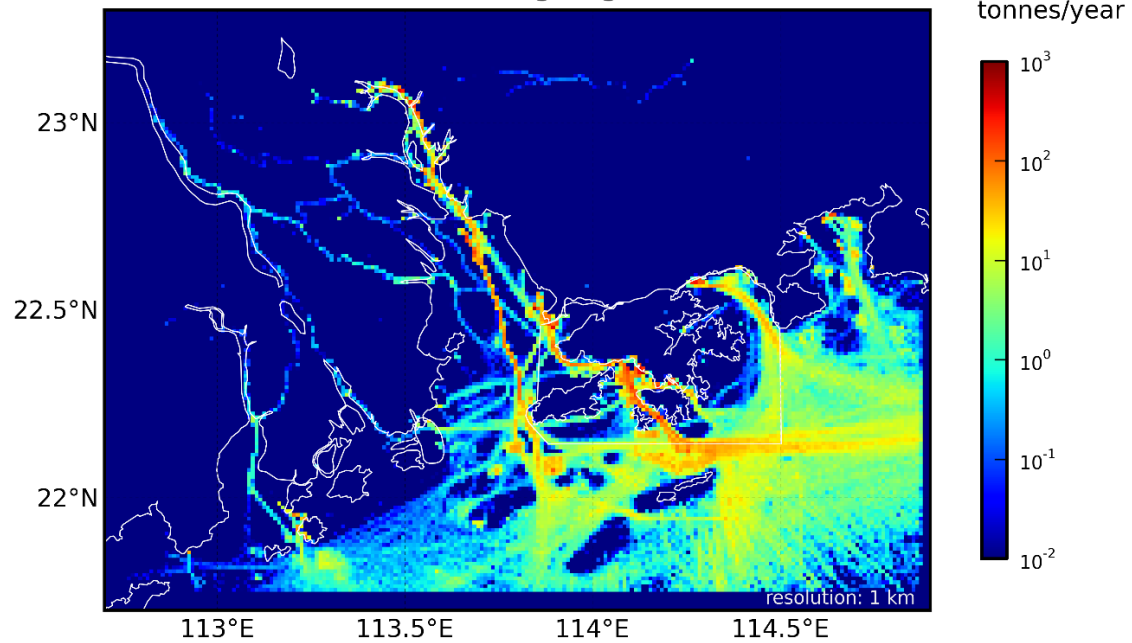
PRD SO_x Emission from Ocean-going Vessel in 2015 (tonnes)



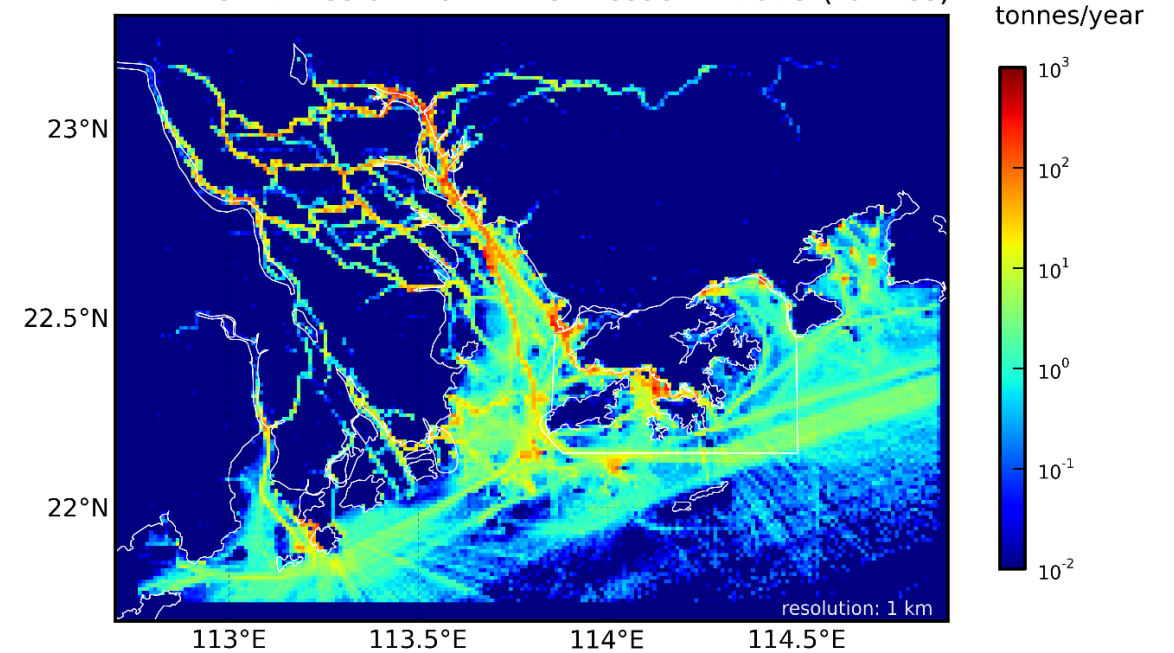
PRD SO_x Emission from River Vessel in 2015 (tonnes)



PRD NOx Emission from Ocean-going Vessel in 2015 (tonnes)

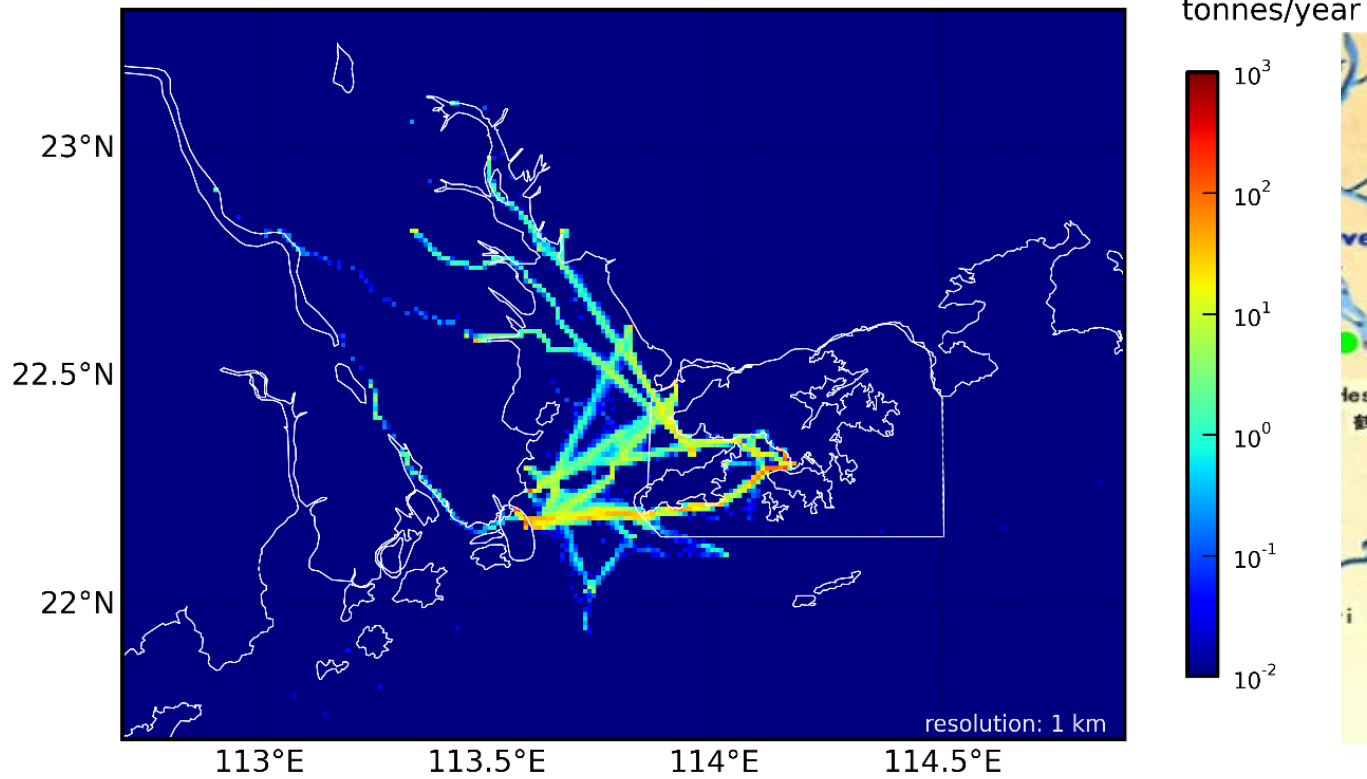


PRD NOx Emission from River Vessel in 2015 (tonnes)



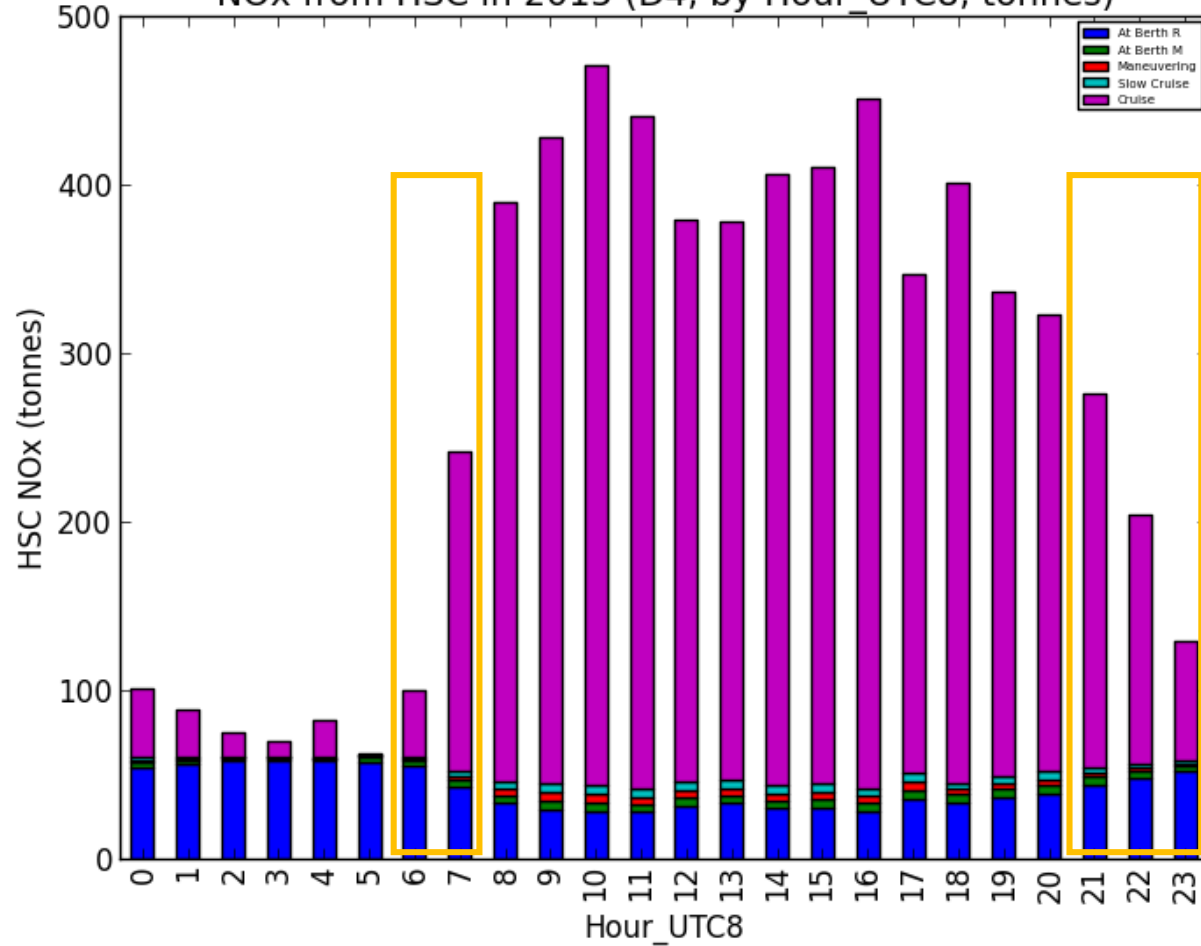
→ Ship Activity

PRD NOx Emission from High Speed Craft in 2015 (tonnes)



Source: Ship Routes of CKS, TurboJet

NOx from HSC in 2015 (D4, by Hour UTC8, tonnes)



Marine Navigation - Summary of Marine Traffic Activities

Table 1: Daily Sailing Schedule of Skypier

Company	From	To	Departure Time
CKS	Sherzhen Shekou	Hong Kong	7:45
Turbojet	Shekou	Hong Kong	7:45
Turbojet	Macau	Hong Kong	7:30
CKS	Hong Kong	Sherzhen Shekou	9:00
CKS	Sherzhen Airport Fuyong Terminal	Hong Kong	8:30
CKS	Macau Outer Harbour Ferry Terminal	Hong Kong	8:20
CKS	Sherzhen Shekou	Hong Kong	8:45
Turbojet	Shekou	Hong Kong	8:45
CKS	Dongguan Humen	Hong Kong	8:15
CKS	Hong Kong	Zhongshan	9:35
CKS	Hong Kong	Sherzhen Shekou	9:50
Turbojet	Hong Kong	Macau	10:00
Turbojet	Macau	Hong Kong	9:15
CKS	Macau Taipa	Hong Kong	9:25
CKS	Hong Kong	Sherzhen Airport Fuyong Terminal	10:15

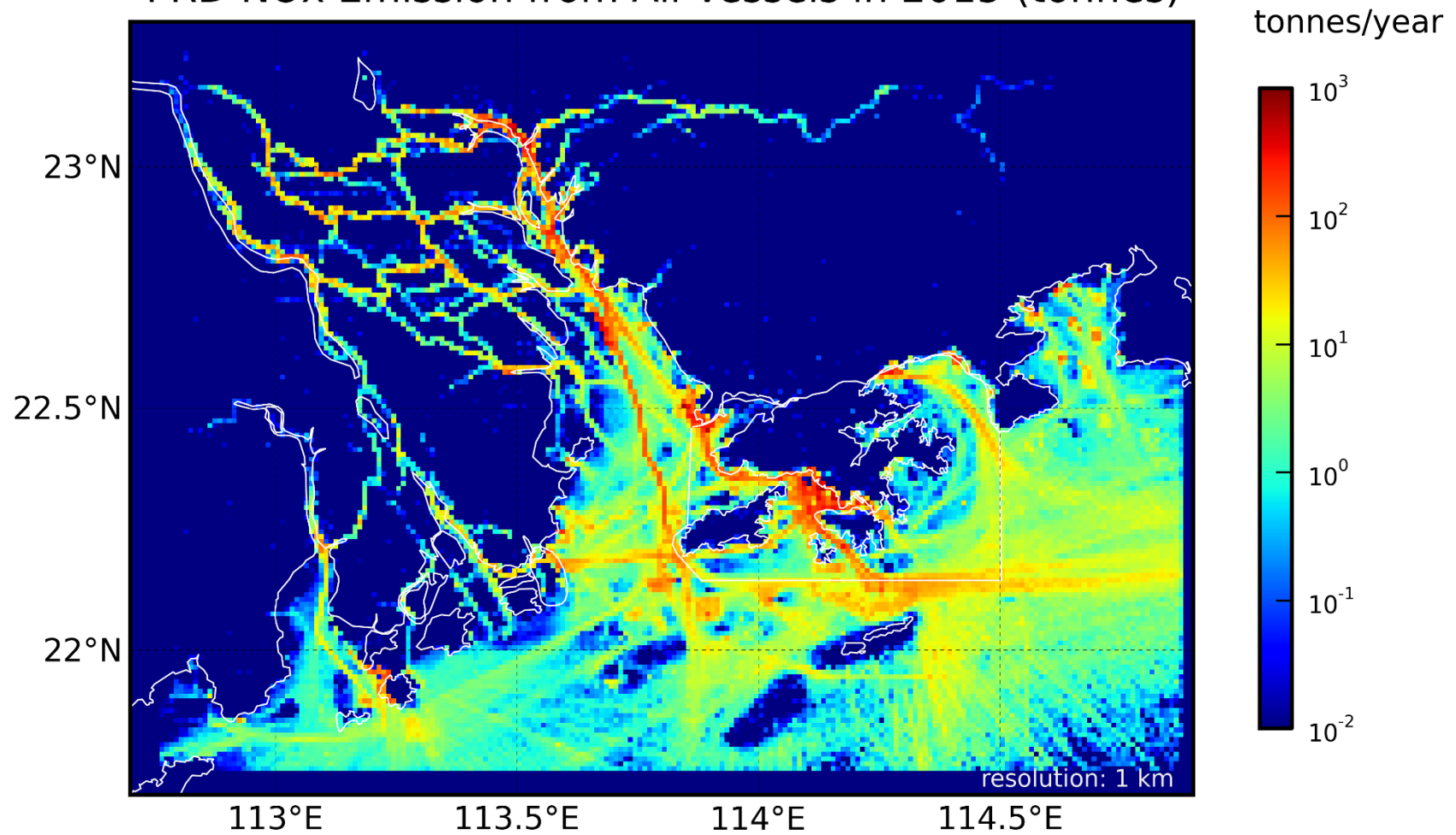
7 am

.....

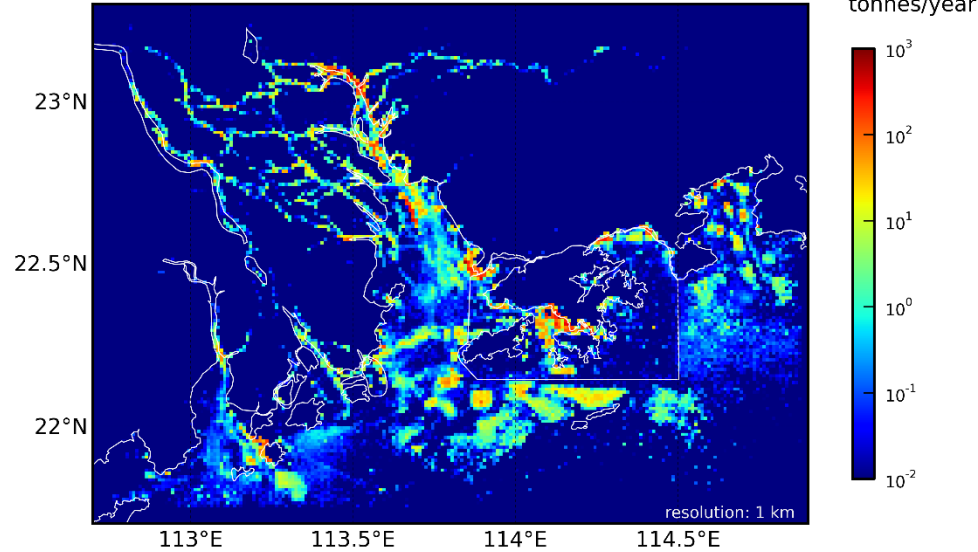
CKS	Hong Kong	Sherzhen Shekou	19:30
Turbojet	Hong Kong	Macau	19:50
CKS	Sherzhen Shekou	Hong Kong	19:30
Turbojet	Shekou	Hong Kong	19:30
CKS	Hong Kong	Jiuzhou Port Zhuhai	20:00
CKS	Hong Kong	Sherzhen Airport Fuyong Terminal	20:00
CKS	Hong Kong	Zhongshan	20:10
CKS	Hong Kong	Sherzhen Shekou	20:30
CKS	Sherzhen Shekou	Hong Kong	20:15
Turbojet	Shekou	Hong Kong	20:15
Turbojet	Macau	Hong Kong	20:15
CKS	Sherzhen Shekou	Hong Kong	20:45
CKS	Hong Kong	Sherzhen Shekou	21:20

9-10 pm

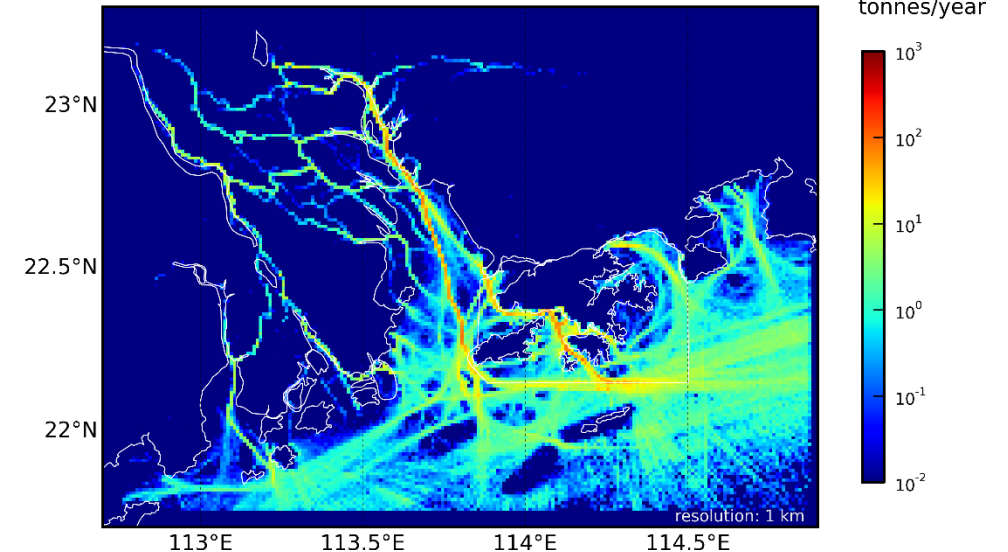
PRD NOx Emission from All Vessels in 2015 (tonnes)



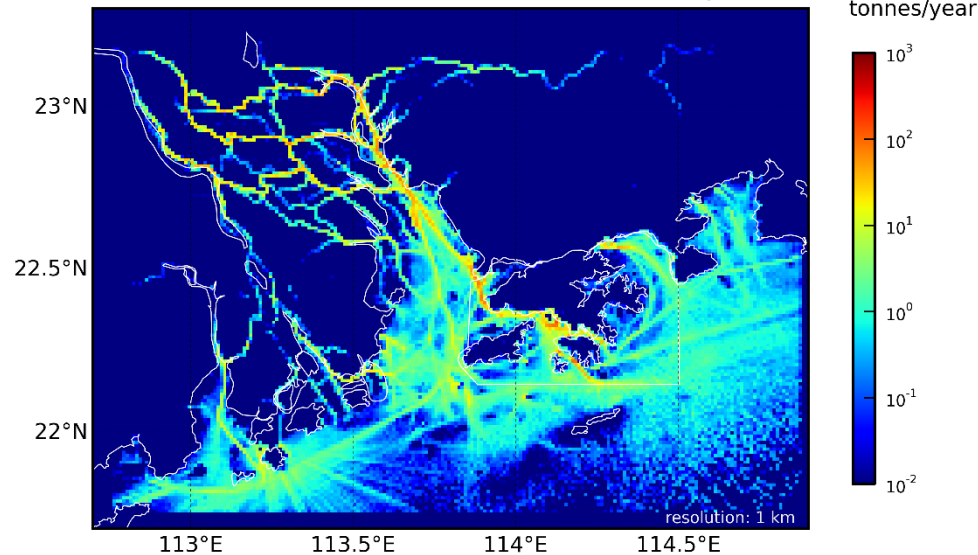
PRD NO_x Emission from All Vessels in 2015 (tonnes), Speed: < 0.1 knot
tonnes/year



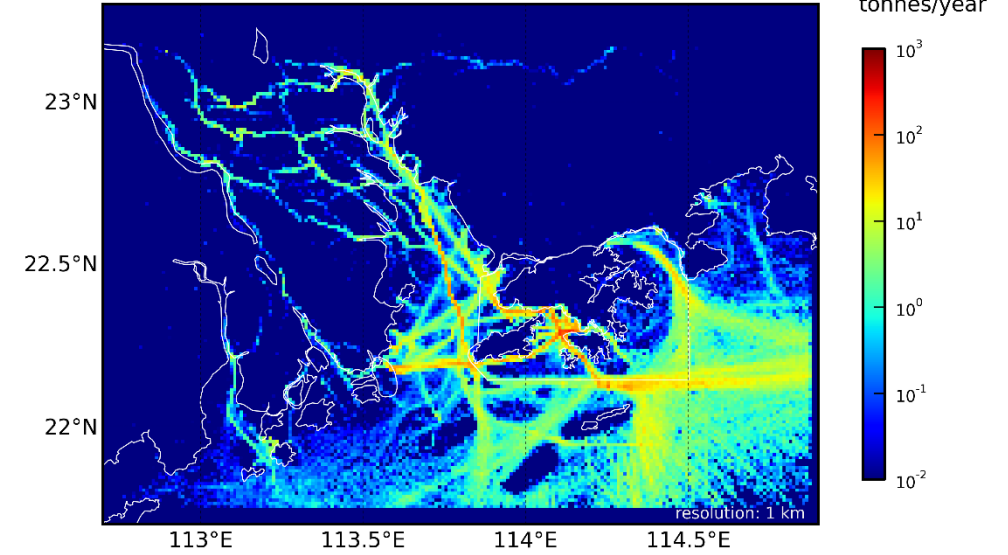
PRD NO_x Emission from All Vessels in 2015 (tonnes), Speed: 8~12 knots
tonnes/year



PRD NO_x Emission from All Vessels in 2015 (tonnes), Speed: 1~8 knots
tonnes/year



PRD NO_x Emission from All Vessels in 2015 (tonnes), Speed: > 12 knots
tonnes/year



Vessel	Fuel (S %)	SO ₂ (tonnes, %)		PM ₁₀ (tonnes, %)		NO _x (tonnes, %)	
		tonnes	%	tonnes	%	tonnes	%
OGV	2.7	61,226	98.1%	7,173	83.4%	62,648	45.3%
HSC	0.04	131	0.2%	123	1.4%	6,592	4.8%
RV	0.04	1031	1.7%	1302	15.1%	69,070	49.9%
sum	--	62,388	100%	8,598	100%	138,310	100%

- An innovative method, based on whole-year global AIS data, is developed to estimate emissions from all vessels with AIS-installed.
- It is necessary to estimate the **emission contributions from unidentified vessels**, especially for the regions with extensive inland river network, e.g. PRD region.

- ❖ Hong Kong PhD Fellowship Scheme of the Research Grants Council
- ❖ Hong Kong Environmental Protection Department (HKEPD)
- ❖ Division of Environment and Sustainability, HKUST

Thank you !

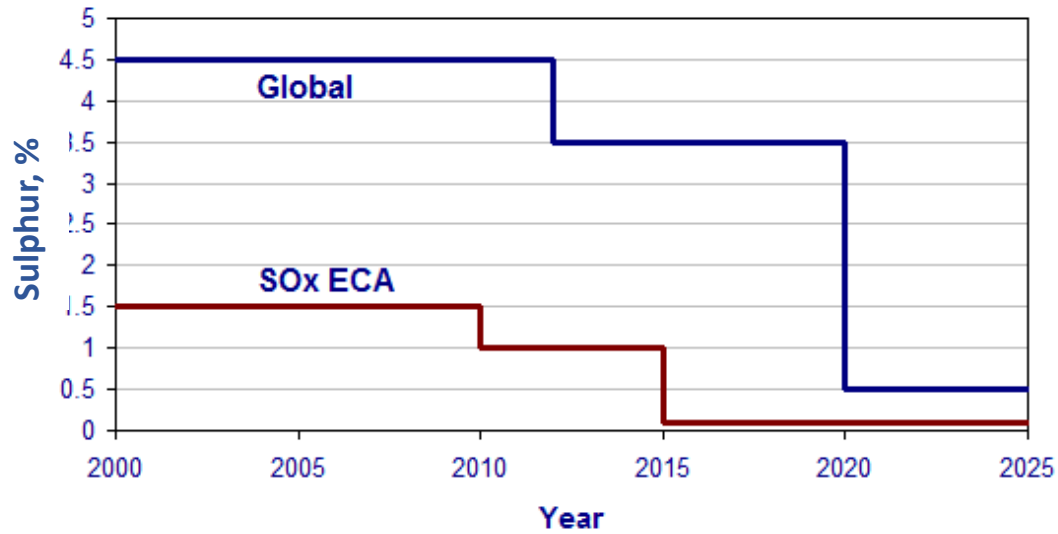
Jackie, Yiqi Zhang
yzhangen@ust.hk



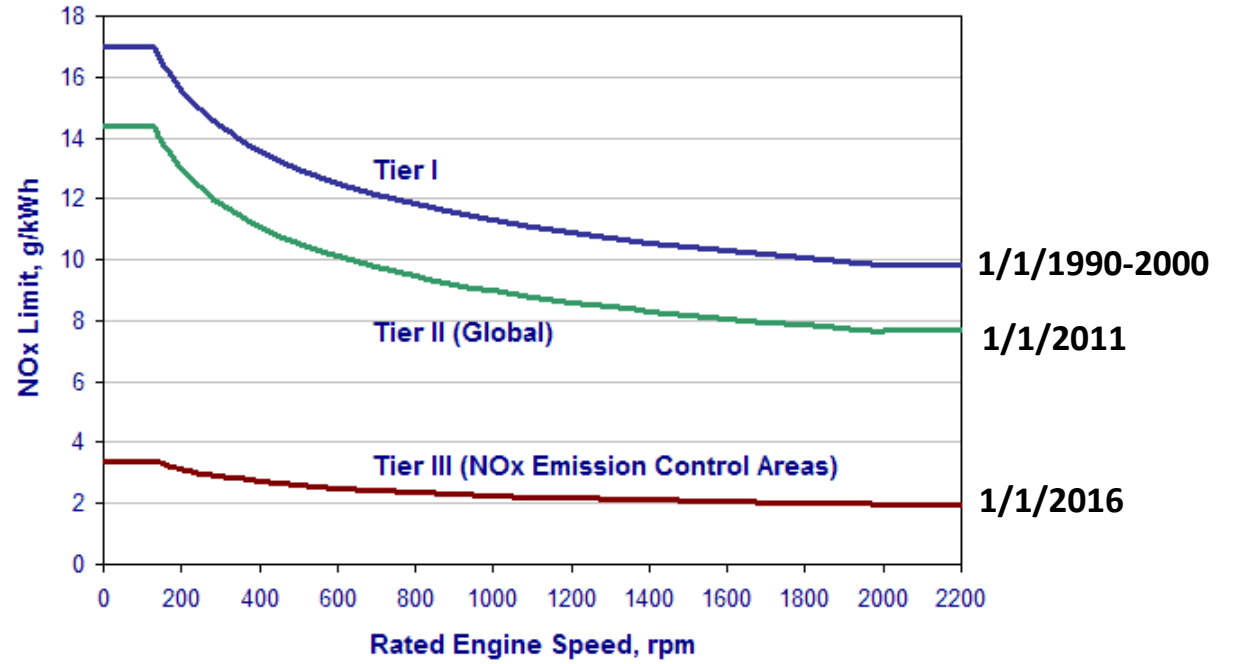
Control Policies



MARPOL Annex VI



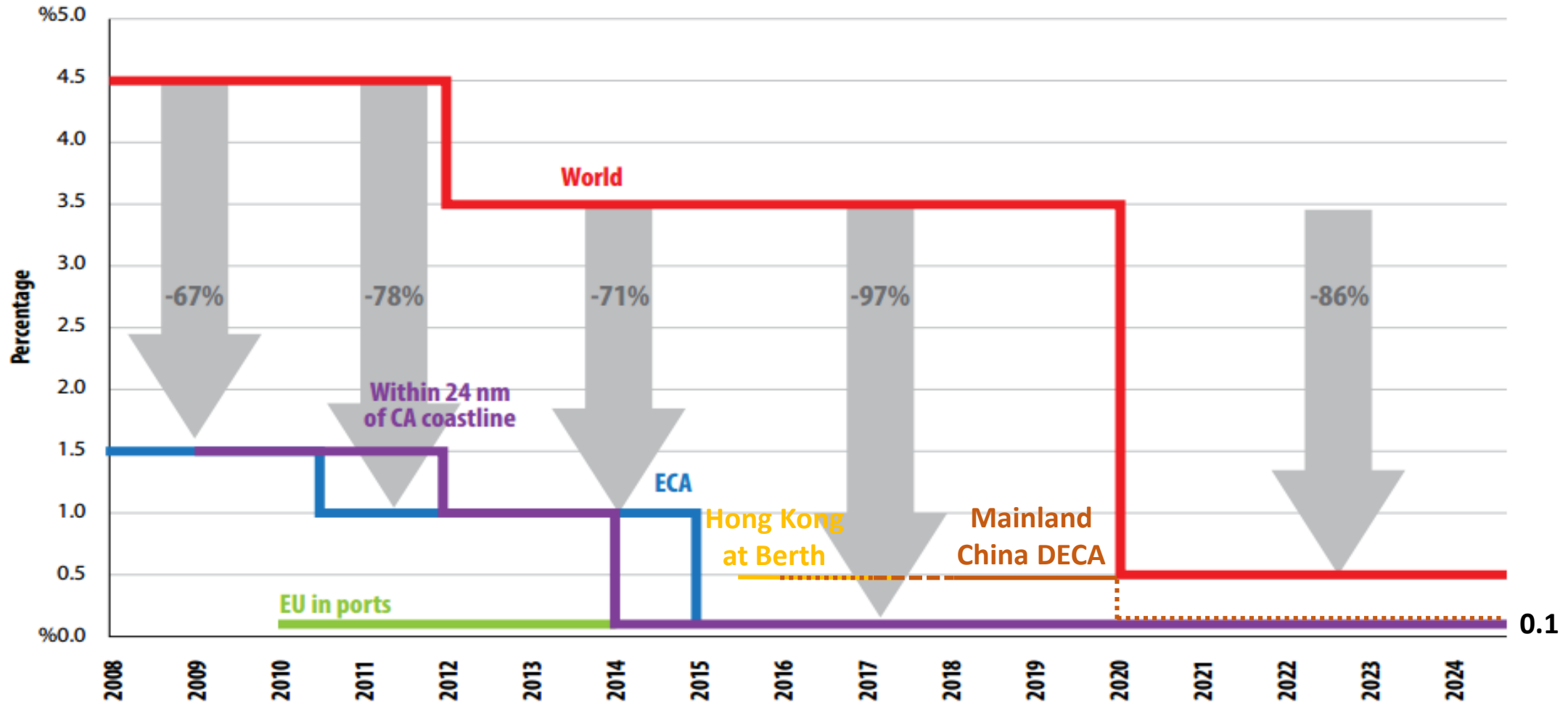
Fuel Sulphur Limits



Engine NO_x Emission Limits

Source: DieselNet; IMO

Control Policies – Fuel Sulphur Content (%)



Source: adapted from Fung, 2014

- **IMO Number:**

- IMO number is assigned by IHS Fairplay (IHSF) to propelled, sea-going merchant ships of 100 GT and above.
- The IMO number is an unique seven digit number. It is **never reassigned** to another vessel
- All OGVs of 100 GT and above **MUST** have IMO number
- Vessels with IMO number are not necessarily OGVs, as IHSF has extended the IMO Scheme on a voluntary basis.

- **AIS Installment:**

- OGVs of 300 GT and above **MUST** install AIS.
- Non-OGVs of 500 GT and above **MUST** install AIS.
- In China, all coastal vessels and cargo/tanker ships of 500 GT and above are required to install AIS.
- In China, most OGVs less than 300 GT and Non-OGVs less than 500 GT have installed AIS.

How to estimate marine emission inventory?

$$\textit{Emission} = \textit{Engine Work Output} \times \textit{Emission Factor}$$

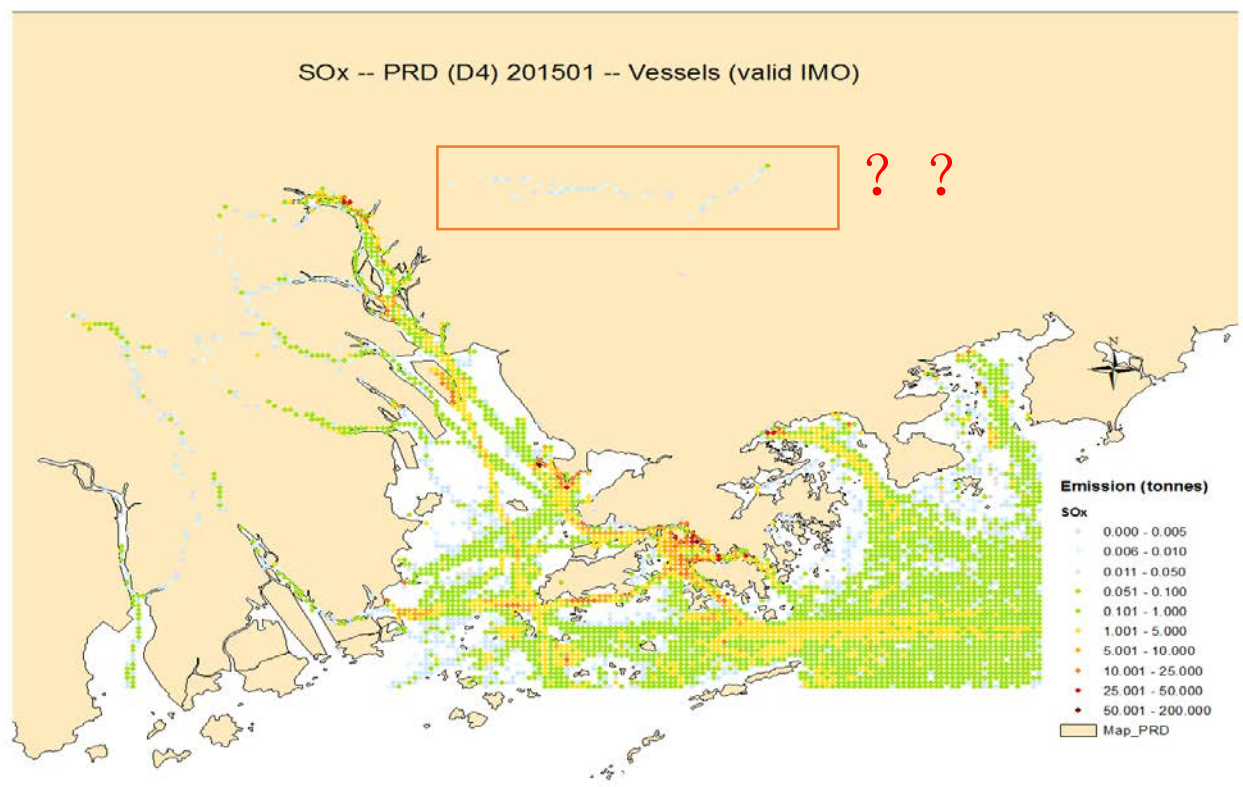
$$\textit{Engine Load} \times \textit{Activity Time}$$



For Main Engine:

$$\textit{Engine Load} = \textit{Engine Maximum Power} \times \left(\frac{\textit{real-time Speed}}{\textit{Ship Maximum Speed}} \right)^3$$





Estimated AIS records

```

|IMO|MMSI|CallSign|ShipName|ShipType|Length1|Beam1|Draught|Speed|La
|9626223|413475560|AXXS|YUESHAOGUANHUO2929|Cargo|67.0|13.0|0.0|6.5|
|9626223|413475560|BOKL|YUESHAOGUANHUO2929|Cargo|67.0|13.0|0.0|0.23
    
```

AIS Live

HUA LONG

Anchor Handling Tug Supply

WatchList

MMSI **413475660**

Callsign **BOKL**

IMO **9626223**

Last seen **1 day ago**

Last port **Huizhou Dongma**

Destination **Lufenei**

YUESHAOGUANHUO 2929

Cargo

WatchList

MMSI **413475560**

Callsign **AXXS**

IMO **9626223**

Last seen **20 days ago**

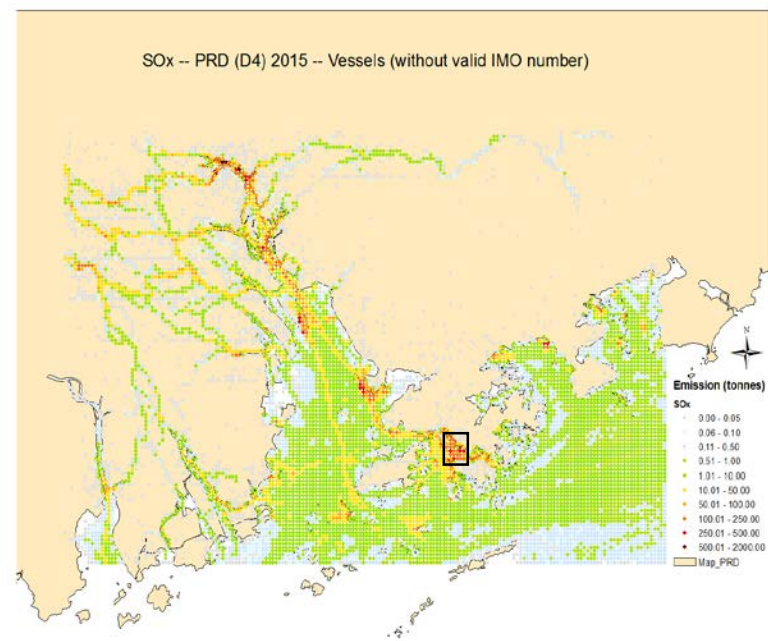
Destination **N/A**

World Registration of Ship

IMO	MMSI	CallSign	ShipName	Statcod	Status	Length	Beam	Draught	MaxSpeed
9626223	413475660	BOKL	Hua Long	B21B2OA	Delivered	75	16.5	6.1	14.5

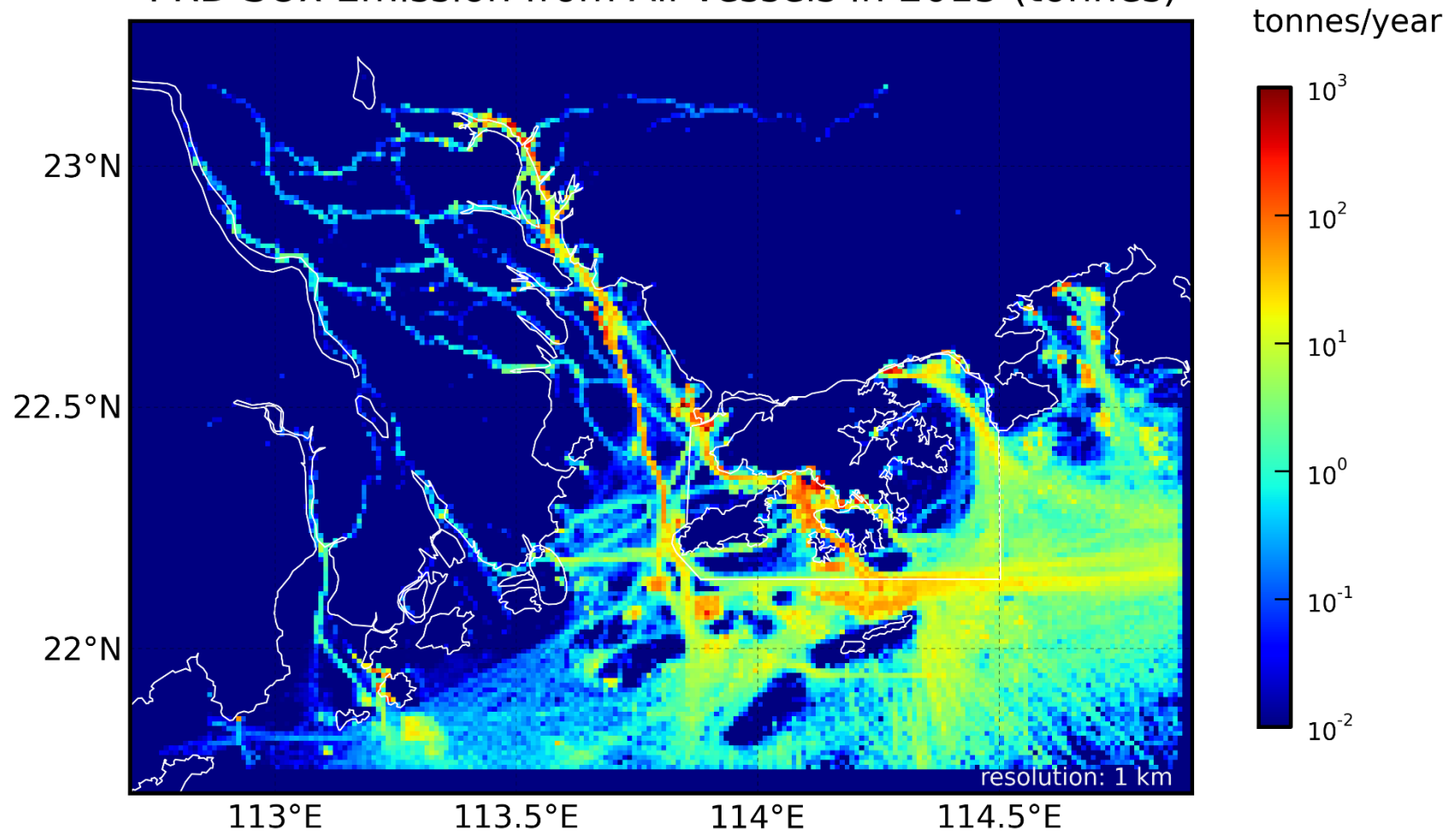
IMO	MMSI	CallSign	ShipName	ShipType	Length1	Beam1	Draught	Speed	Latitude	Longitude
9999999	412469620	BXQQ	JIANGONG188	Unknown	78.0	16.0	3.5	8.5	22.297432	114.149917
9876543	412418880	BLAT3	JIAYUAN99	Cargo	94.0	14.0	5.5	8.4	22.2922	114.13
9678056	477995299	VRLZ	TAIMINI	Tanker	1.0	1.0	0.0	2.9	22.3279	114.128
9600000	201208170		TEST1	Unknown	50.0	10.0	0.0	0	22.306053	114.122787
9505508	266772656	BBTPT	DGSHI001	Unknown	40.0	8.0	8.8	0	22.3244	114.151
9348182	636014884	A8XE9	ASTERIX	Cargo	1.0	1.0	9.9	0	22.336667	114.127833
9306119	636091487	A8OK4	POEQSINA	Cargo	213.0	32.0	8.2	0	22.329783	114.13215
9306117	565425000	9VRB5	KLEI316	Cargo	213.0	32.0	11.3	0	22.338783	114.12605
9100000	477990007	BADCCBA	FAT	Unknown	30.0	10.0	0.0	0	22.3287	114.129
9041000	413465410	B	IUIJINQIAO181	Unknown	1.0	1.0	0.0	0	22.3119	114.146
9013414	477911000	VRZS8	WINGDART	Cargo	50.0	14.0	8.6	7.6	22.290513	114.130352
8084521	413464990	61035	HUIJINQIAO91	Cargo	49.0	15.0	3.6	0	22.3048	114.15
8061113	413888890	TSTAISB	HAITAI1HAO	Passenger	73.0	14.0	1.4	0	22.301762	114.123152
7869000	412000008	0	WOTADO	Tender	1.0	1.0	0.0	9.7	22.3004	114.128
7078001	726872647	00000000	00000000000000000000	Law Enforcement	96.0	96.0	4.8	0.1	22.3057	114.123
5536481	412234567	0	SH	Cargo	50.0	6.0	0.0	6.9	22.2933	114.142
5368876	477995084		PILOT5	Pilot Boat	14.0	4.0	0.0	0.2	22.3117	114.159
4973155	412468480	LT6KO	HUIJINQIAO78	Cargo	49.0	15.0	3.5	0.6	22.3118	114.125
4973000	477995124	VRS4487	PILOT83	Pilot Boat	14.0	4.0	0.0	17.6	22.291367	114.137872
4972000	477995123	VRS4486	PILOT82	Pilot Boat	14.0	4.0	0.0	16.2	22.293305	114.13329
4971000	477995122	VRS4485	PILOT81	Pilot Boat	14.0	4.0	0.0	0.7	22.318707	114.149438
4567893	413762739	100200	GUANGBOYUN1000	Cargo	49.0	13.0	0.4	0	22.3056	114.157
4463458	413470140	C3	HUIHAILONG168	Cargo	52.0	17.0	3.8	1.1	22.3257	114.129
4416707	412468480	LNKAW	HUIJINQIAO78	Cargo	49.0	15.0	3.5	0.4	22.3122	114.15
4124732	412473290		NANHANG737	Cargo	75.0	15.0	4.5	0	22.3022	114.15
4124696	412469680		HUIGANGTONG133	Cargo	50.0	14.0	2.0	6.3	22.299	114.128
4047147	413900952	TSTAISB	RONGJING98	Cargo	49.0	13.0	4.2	0.3	22.312137	114.122573
3849388	359593872	PAHPAU1	IDAXXSQDTHUD	Cargo	625.0	78.0	6.0	0	22.2905	114.139

IMO	MMSI	CallSign	ShipName	Statcod	Status	Length	Beam	Draught	MaxSpeed
9678056		VRLZ2	Taimin 1	A13B2TP	Delivered	48	13.8	5	9
9505508	259073000	LGSY	Havila Sub B22A2OR		Delivered	98	19.771	8	11.1
9348182			Asterix	A33A2CC	Delivered	182.46	25.2	10	20.2
9013414		3FKW3	Tuo Fu 3	A21A2BC	Scrapped	228.5	32.2	13.29	14.3

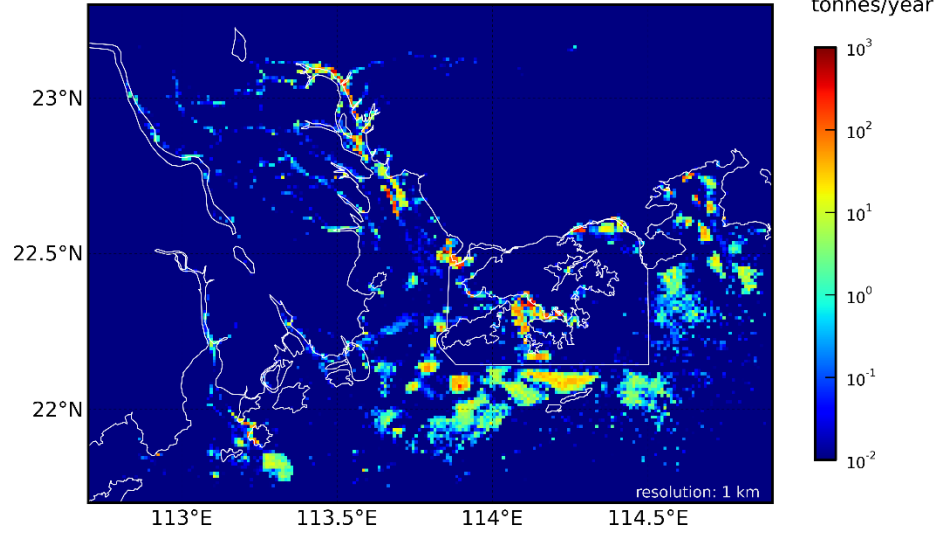


SOx Estimates (tonnes)	Original Data (A)	STL Median (B)	Ratio (B/A)
Unidentified Vessels	1,031	--	--
Identified Vessels	61,357	53,994	0.88

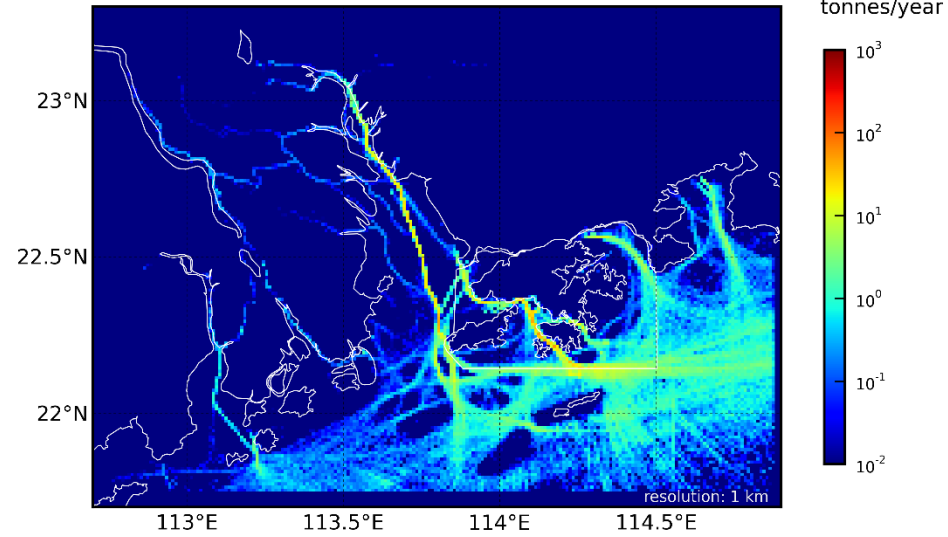
PRD SOx Emission from All Vessels in 2015 (tonnes)



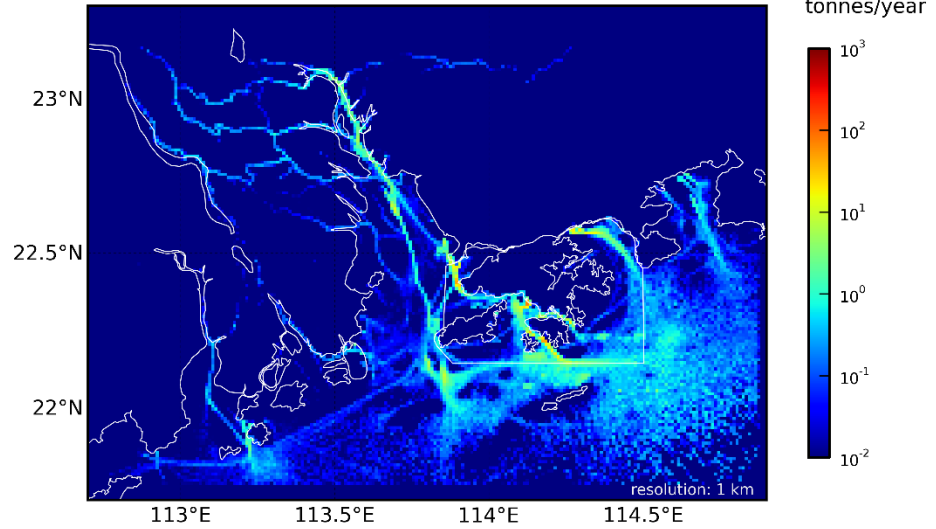
PRD SOx Emission from All Vessels in 2015 (tonnes), Speed: < 0.1 knot
tonnes/year



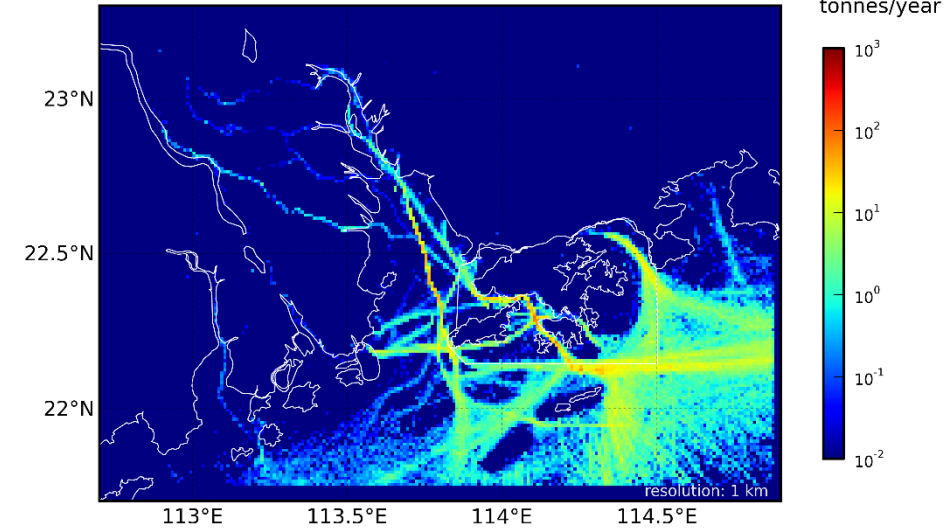
PRD SOx Emission from All Vessels in 2015 (tonnes), Speed: 8~12 knots
tonnes/year



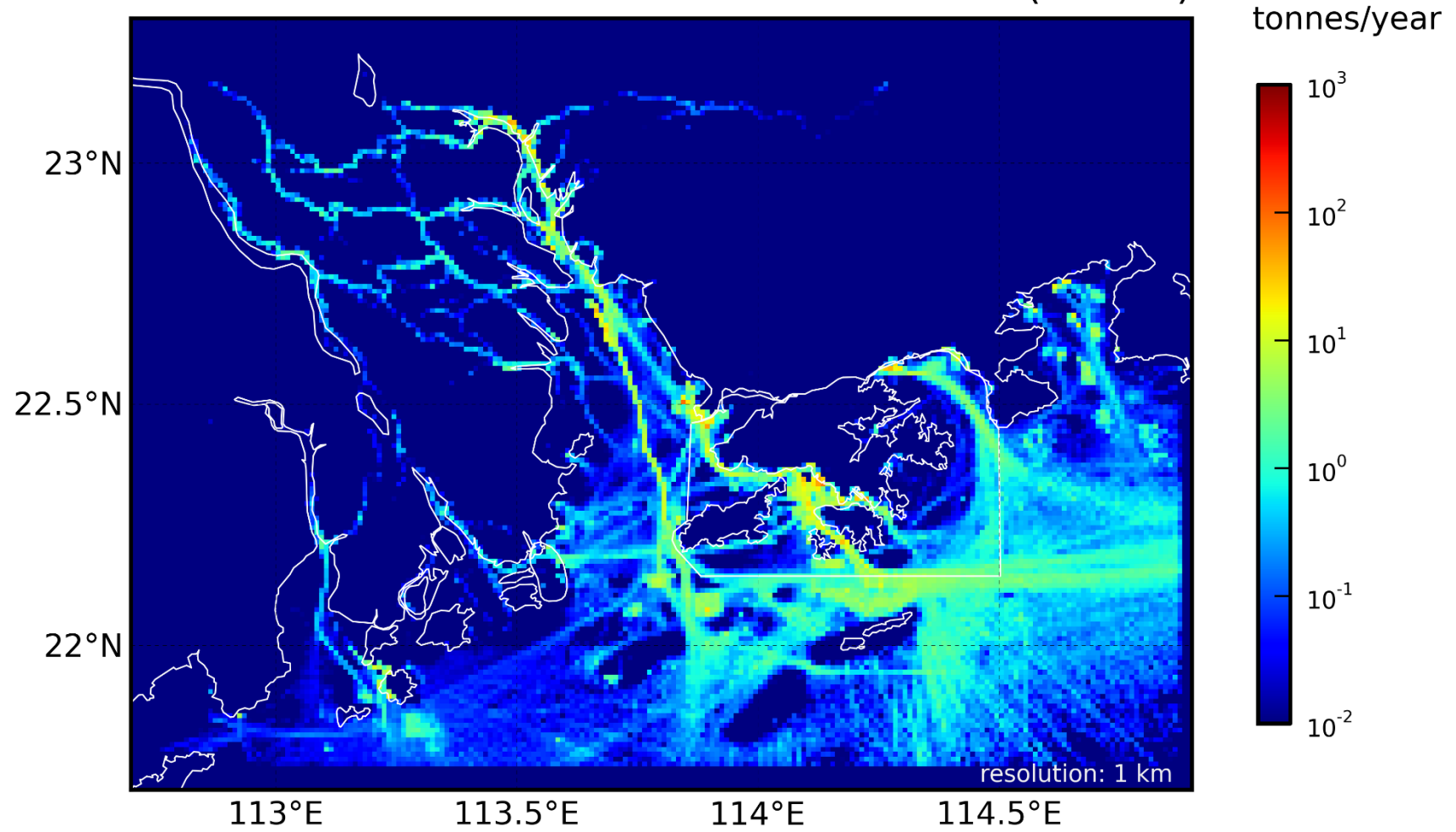
PRD SOx Emission from All Vessels in 2015 (tonnes), Speed: 1~8 knots
tonnes/year

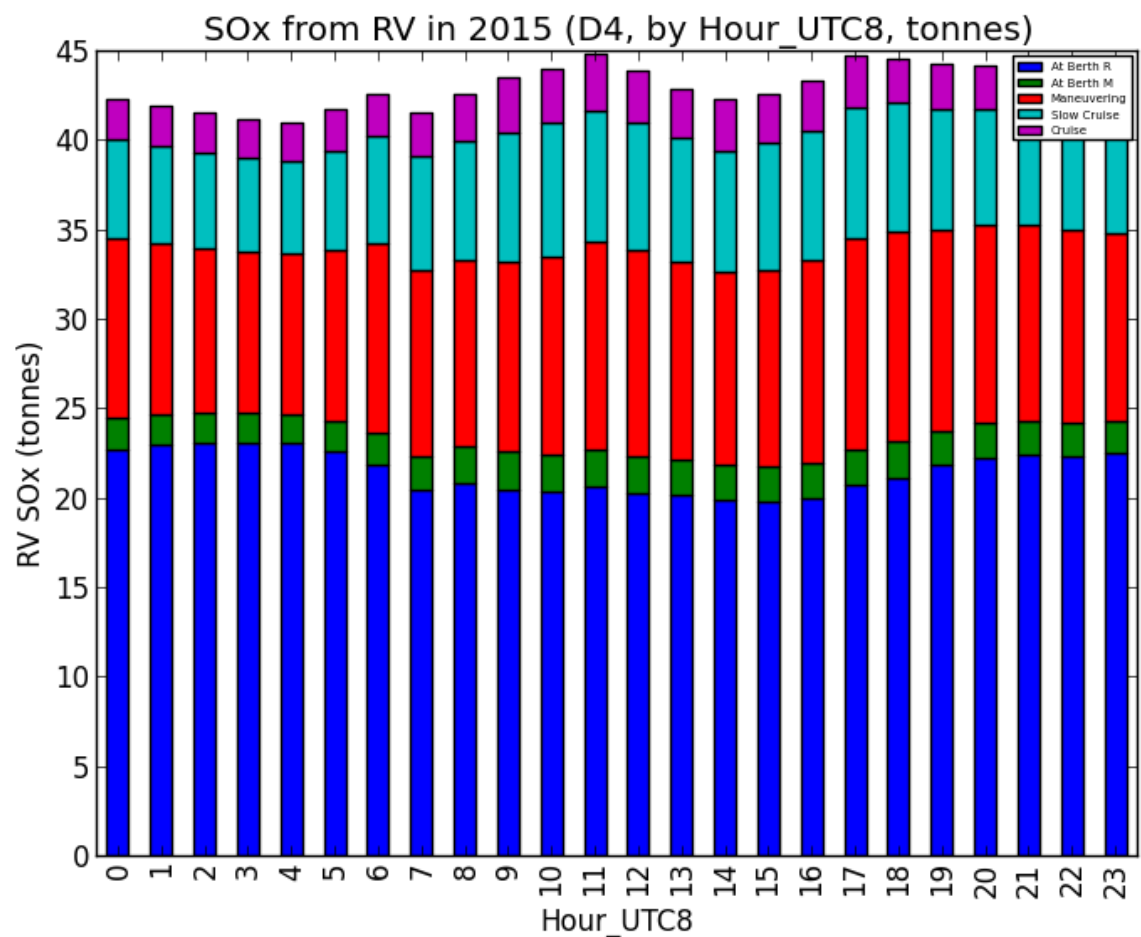
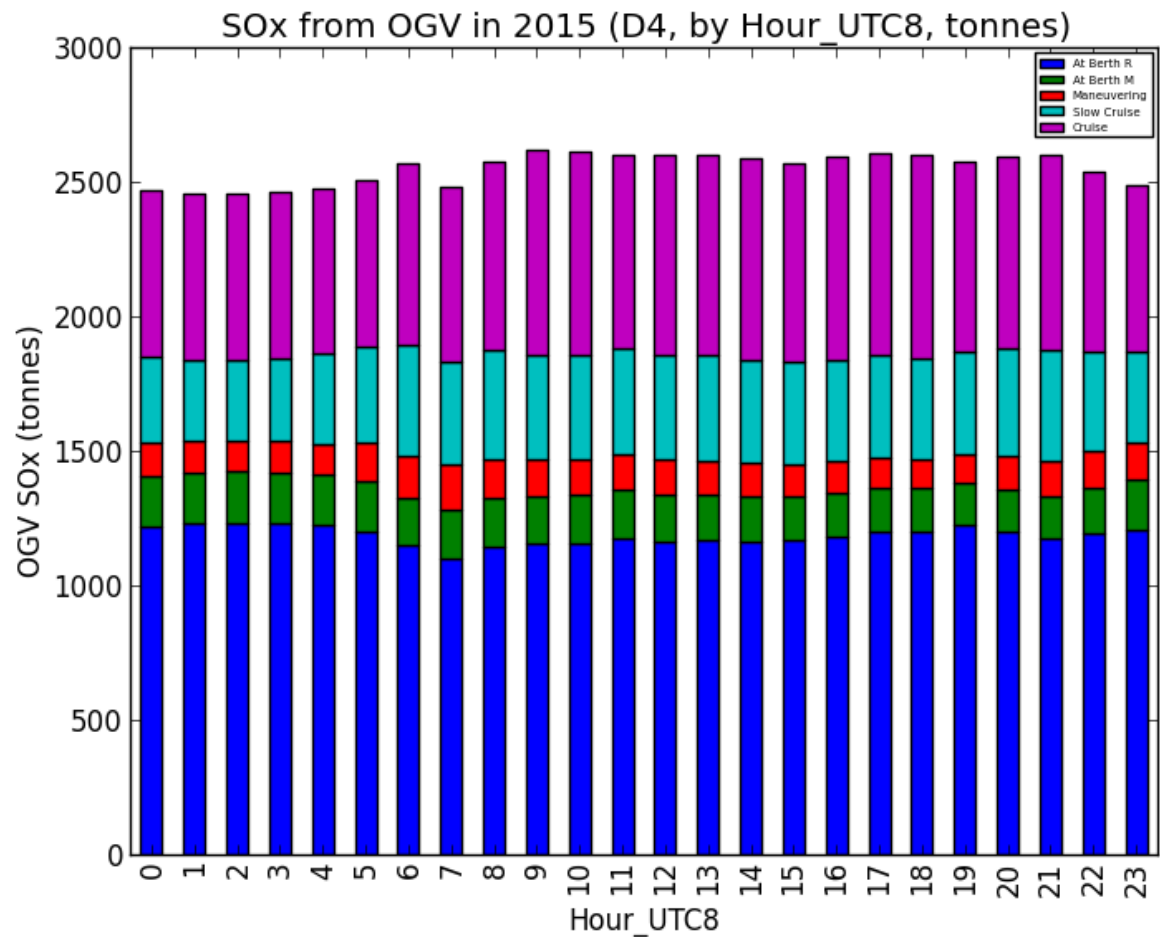


PRD SOx Emission from All Vessels in 2015 (tonnes), Speed: > 12 knots
tonnes/year



PRD PM10 Emission from All Vessels in 2015 (tonnes)





Emission Factors $EF(fuel) = EF(baseline) \times Fuel\ Correction\ Factor(fuel)$

Baseline Emission Factors (HFO with 2.7% sulphur content)

Engine Type	Type	PM10	PM2.5	NOx	SOx	CO	HC
Slow	T0	1.50	1.20	18.10	10.50	1.40	0.60
Slow	T1	1.50	1.20	17.00	10.50	1.40	0.60
Slow	T2	1.50	1.20	14.40	10.50	1.40	0.60
Medium	T0	1.50	1.20	14.00	11.50	1.10	0.50
Medium	T1	1.50	1.20	13.00	11.50	1.10	0.50
Medium	T2	1.50	1.20	11.20	11.50	1.10	0.50
High	T0	1.50	1.20	14.00	11.50	1.10	0.50
High	T1	1.50	1.20	9.80	11.50	1.10	0.50
High	T2	1.50	1.20	7.70	11.50	1.10	0.50

Fuel Correction Factors

Fuel (S%)	PM10	PM25	NOx	SOx	CO	HC
2.7	1	1	1	1	1	1
0.05	0.16	0.16	0.94	0.019	1	1
0.04	0.16	0.16	0.94	0.015	1	1

Emission Factors