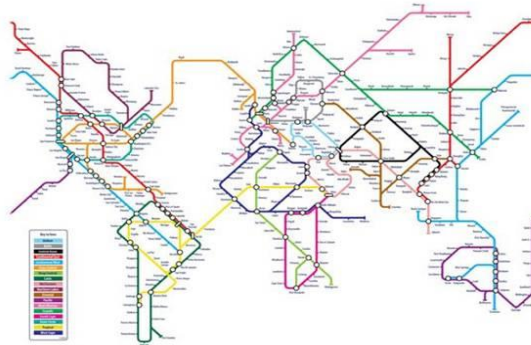


# Econometric Benchmarking of Metro Operating Costs. Methods and Applications.



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# Railway and Transport Strategy Centre (RTSC)



Community of Metros  
**CoMET**

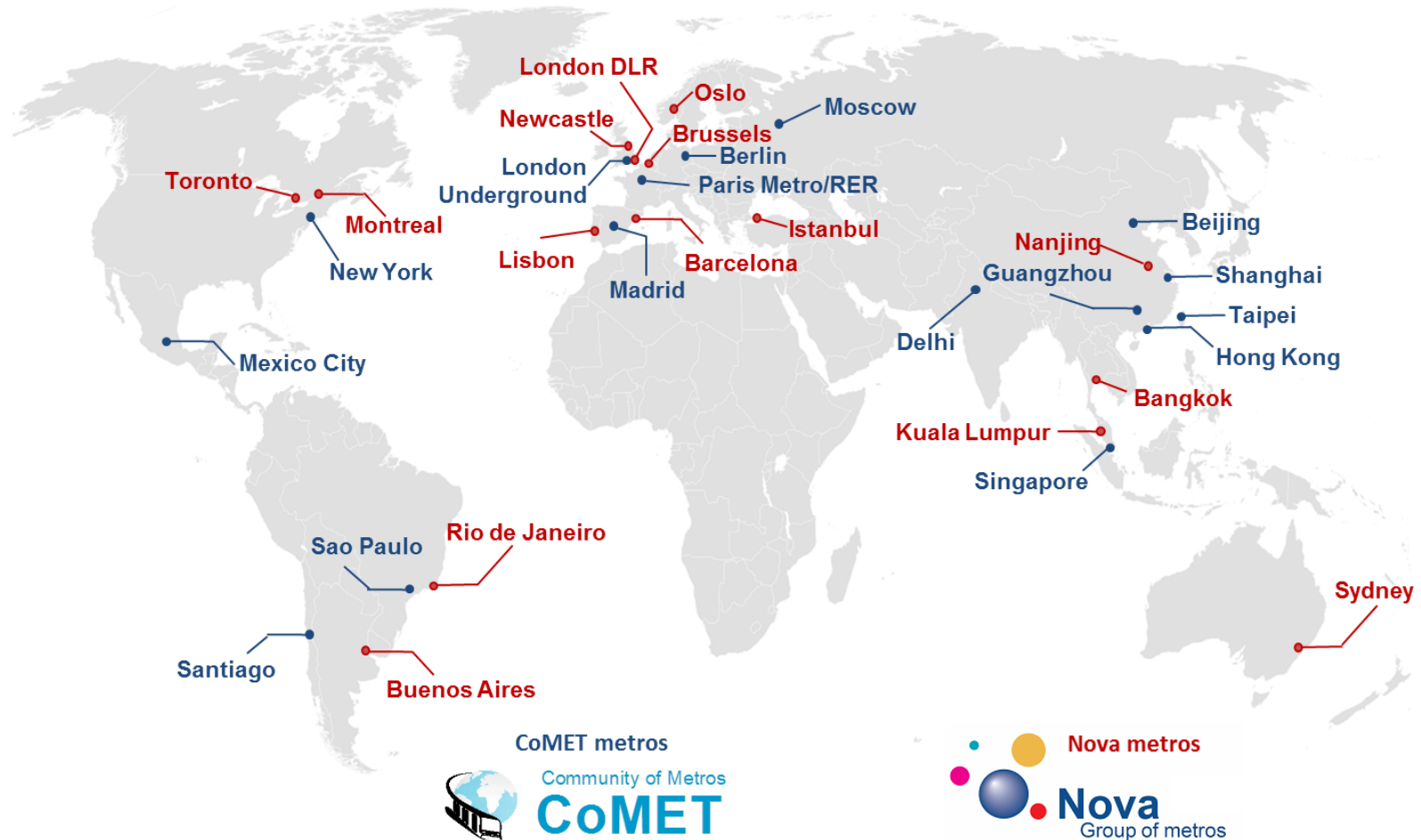


**ISBERG**

**ABBG**

**IBBG**

# CoMET and Nova Consortia (RTSC)



# What's a Metro?

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## High Capacity



## Independent



## High Frequency

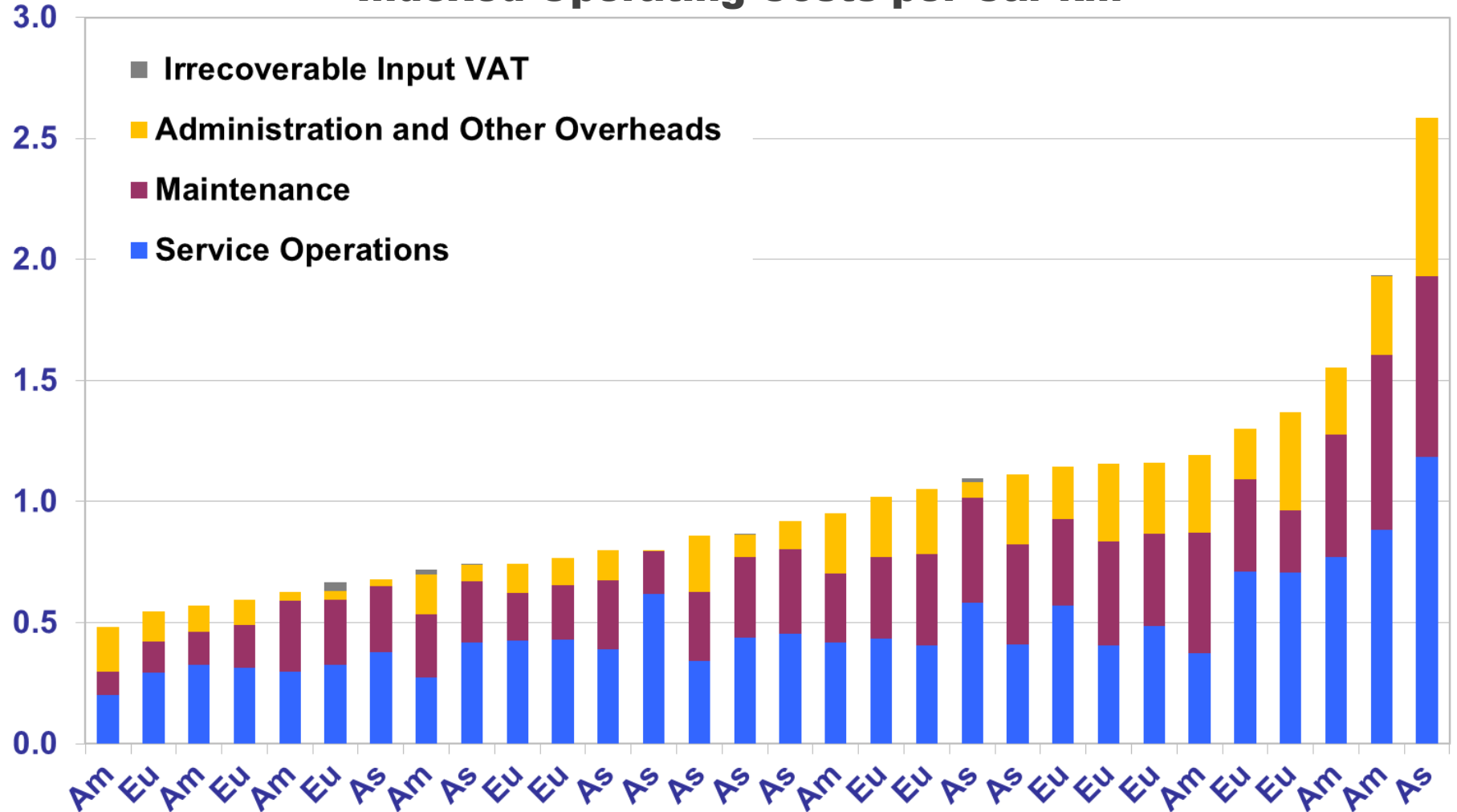


## Operate on Surface and Underground



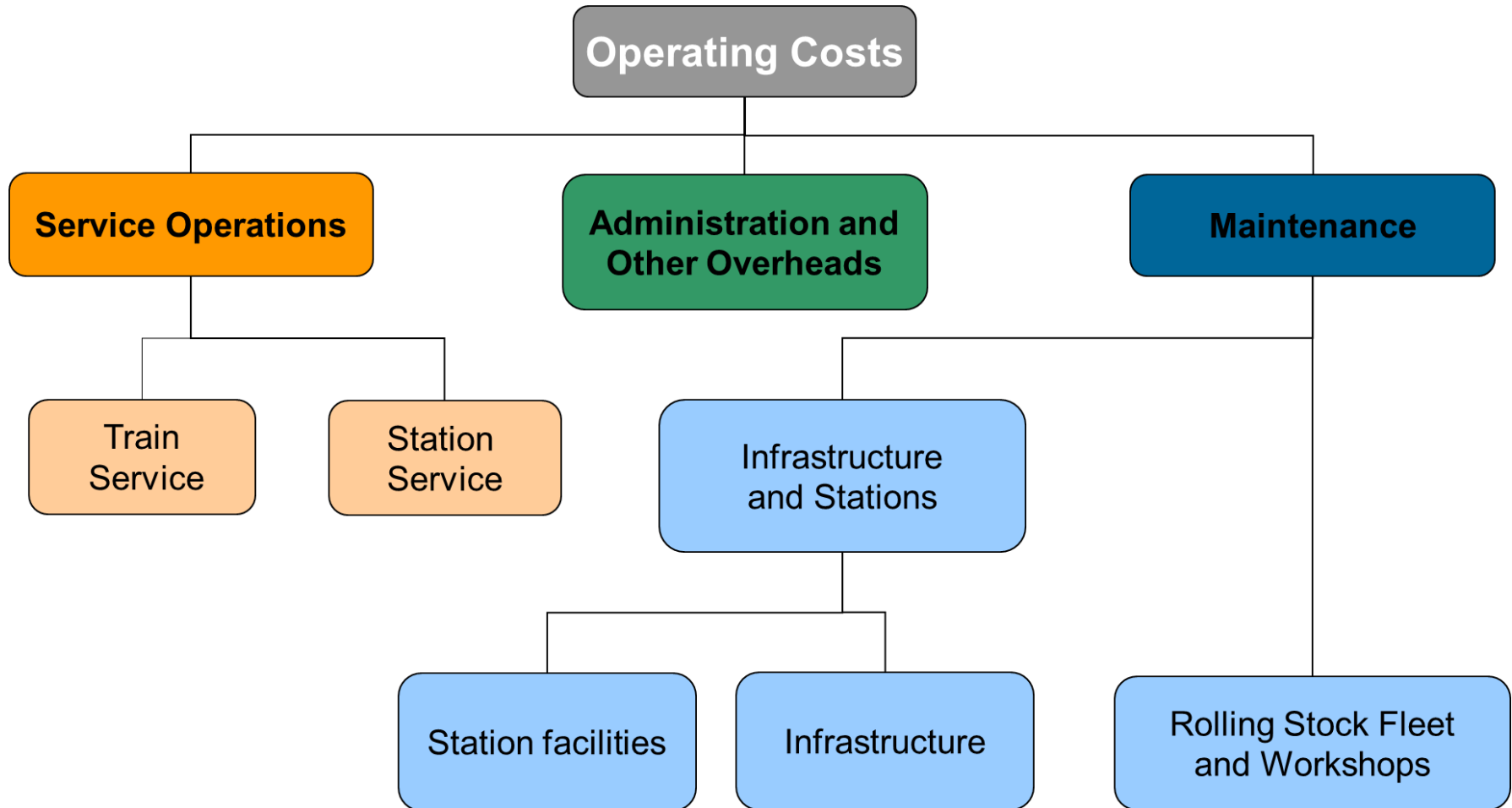
# Introduction

## Indexed Operating Costs per Car km



# Introduction

## Urban Rail System Operating Cost Structure

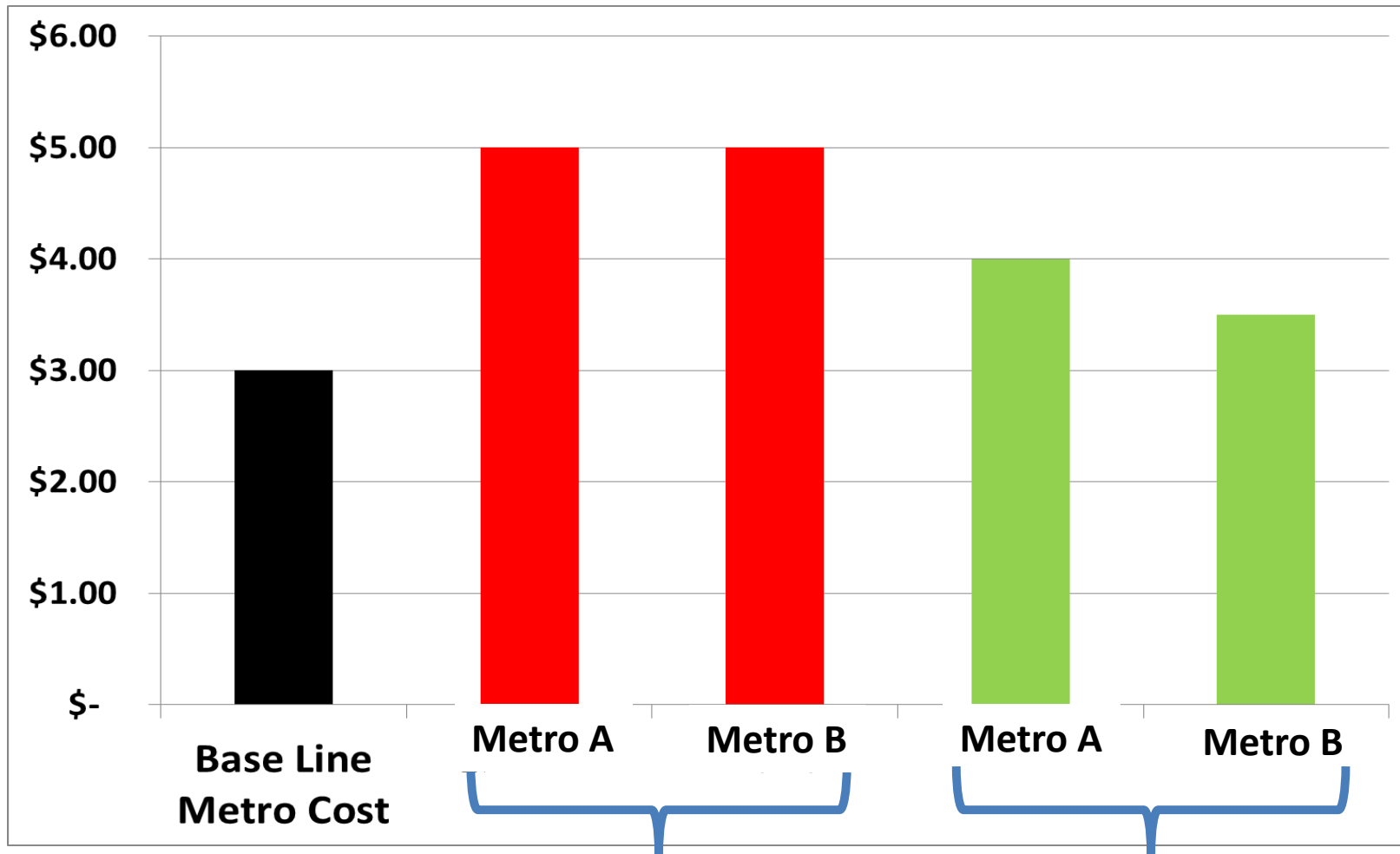


# Introduction

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- Why are some metros more cost efficient than others? (e.g. operating cost per car km or per passenger journey)
- What are the main factors driving cost-efficiency?
  - Are they external or structural outside of the metro control?
  - Which factors can be more easily changed by metros in order to reduce cost inefficiency?

# Ideal Comparison of Costs



**Actual Cost**

**Estimated Cost with "Base Line"  
Exogenous conditions (e.g. average  
wages, fleet age, etc.)**



# Data

- Originates from two consortia within the RTSC
  - Community of Metros (CoMET)
  - The NOVA Group (NOVA)
- High quality panel data set, covering
  - 24 Metros
  - Period between 2005 - 2012



# Method: Econometrics and Regression Analysis

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**Regression Analysis:** Estimation of a cost function including all the factors considered.

$$\begin{aligned} & \textit{Operating Cost} \\ & = \beta_1 \textit{wages} + \beta_2 \textit{contracted hours}(\%) + \dots + \varepsilon \end{aligned}$$

## **Advantages:**

Straightforward approach.

Direct quantification of the cost factors.

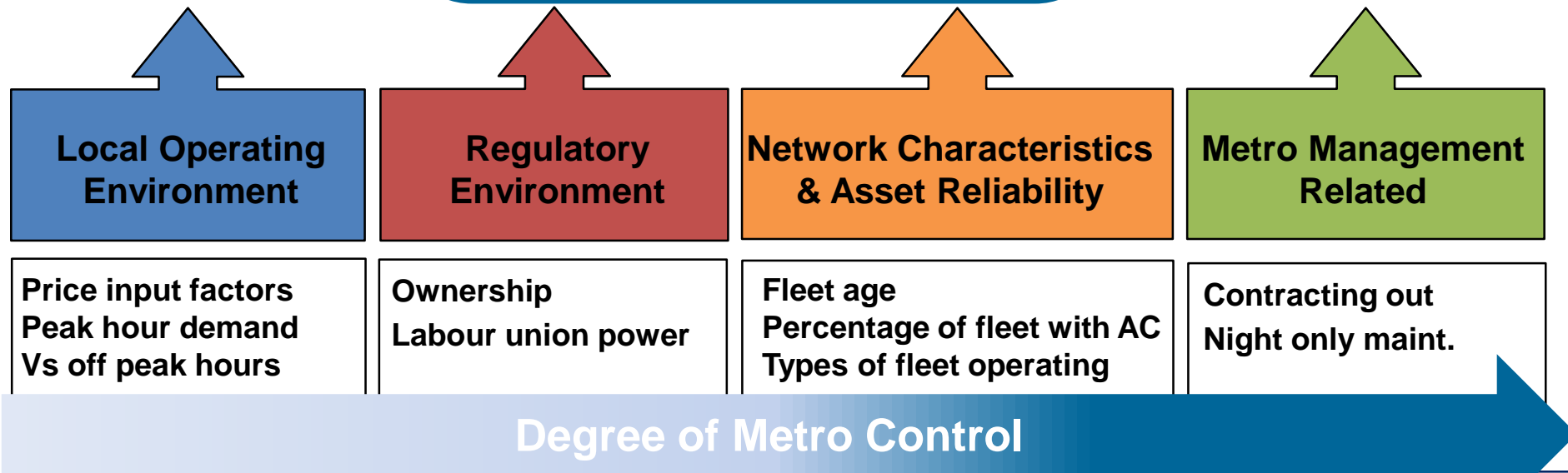
Useful for cost forecast/evaluation of partial changes.

# Factors affecting rolling stock maintenance costs



## Rolling stock maintenance cost

- All maintenance of RS and workshops e.g.: Routine RS checks.
- Cleaning of RS, regular and in-depth
- Support staff and costs associated e.g.: Workshop costs.
- Salaries, training, overtime and any contract labour if exists



# Results – Rolling Stock Maintenance Costs

+10% change in:	% change in RS maintenance cost PER	
	Car km	Car
Car km	<b>-2.4%</b>	<b>+6.7%</b>
Fleet size (number of cars)		<b>-8.9%</b>
RS Maintenance staff hours contracted out	<b>-5.7%</b>	<b>-5.6%</b>
Fleet availability at the peak (%)	<b>+5.1%</b>	<b>+5.8%</b>
Speed	-0.2%	0.0%
Mean distance between failures	<b>-1.1%</b>	<b>-1.1%</b>
% Air conditioned rolling stock	+1.9%	+1.9%
Rolling stock age	-0.0%	-0.0%
Own labour wages	<b>+2.6%</b>	<b>+2.6%</b>
Time trend	<b>-1.8%</b>	<b>-1.6%</b>

Bold coefficients are statistically significant at a 90% confidence level. Detailed table with all variables and t-values in the paper.

# Key findings – Rolling Stock Maintenance

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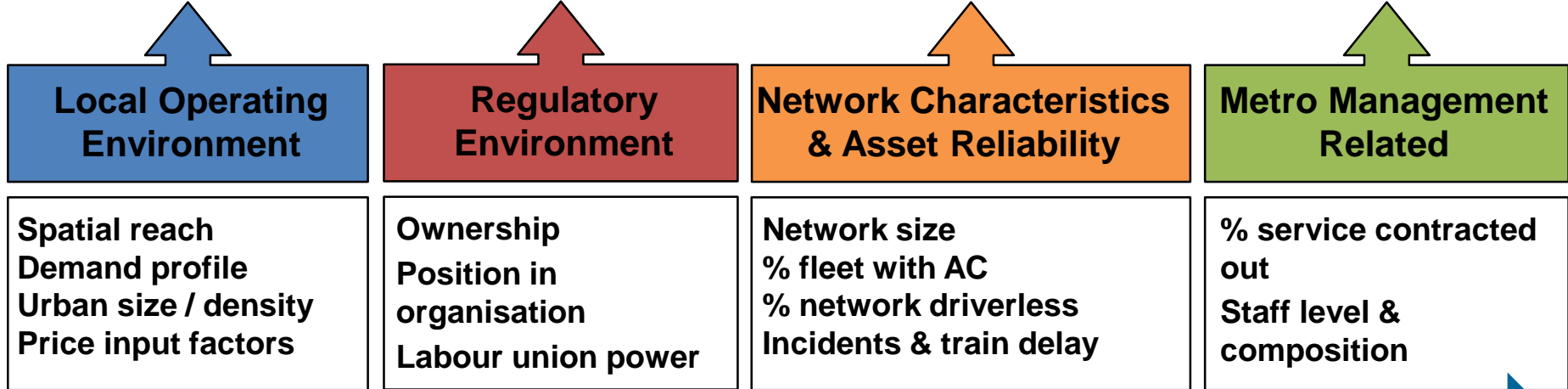
- Costs appear to be proportional to car kilometres travelled by the fleet (+6.5%) so money can be saved in rolling stock maintenance by reducing car kilometres.
- Small economies of scale. If fleet size and car km increased simultaneously by 10%, costs per car will decrease by 1.8%.
- Higher fleet availability at the peak can be costly.
- Contracting out labour reduces rolling stock maintenance costs.
- Higher reliability linked to lower RS maintenance costs.
- Negative time trend ( $\sim -1.8\%$ ). Continuous improvement.

# Factors affecting train service cost efficiency



## Train service operations cost

- Drivers
- Non-driver onboard operations
- Support staff not on trains (e.g. control centre and crew management)
- Operating costs to support train operations (e.g. energy for traction power and for signalling systems)



Degree of Metro Control

# Results – Train Service Costs

+10% change in:	% change in train service cost PER		
	Car km	Passenger Journey	Train hours
Output	<b>-6.6%</b> (car km)	<b>-8.1%</b> (pax journey)	<b>-6.1%</b> (train hours)
Train driver productivity	<b>-4.7%</b>	<b>-4.5%</b>	<b>-5.5%</b>
Train service staff hr. contracted	+0.1%	-0.7%	0.1%
Network length	+1.2%	<b>+2.7%</b>	0.1%
% AC Rolling Stock	-1.8%	<b>-2.5%</b>	<b>-2.0%</b>
Age of the system (per year)	0.0%	-0.0%	-0.0%
Own labour wages	<b>+4.8%</b>	<b>+4.8%</b>	<b>+5.1%</b>
Price of energy	<b>+2.0%</b>	1.5%	<b>+2.1%</b>
Time trend	-0.0%	-0.0%	-0.0%

ns: Non-significant; \*\*\* Significant at 1% level; \*\* Significant at 5% level; \*significant at 10% level.

# Key findings – Train Service Costs

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- Significant returns to density in train service costs per car km (6.6%), per passenger journey (-8.1%) and train hours (-6.1%).
- Labour: a 10% increase in wages would be correlated with an average 5% increase in train service costs. Substitution effects.
- Driver productivity, key for lower train service costs.
- Energy prices are relevant but with a moderate influence (~ 2%)
- Time trend: Once other factors held constant, no time trend found.
- Age of the metro operator seems negligible once all other factors are considered.

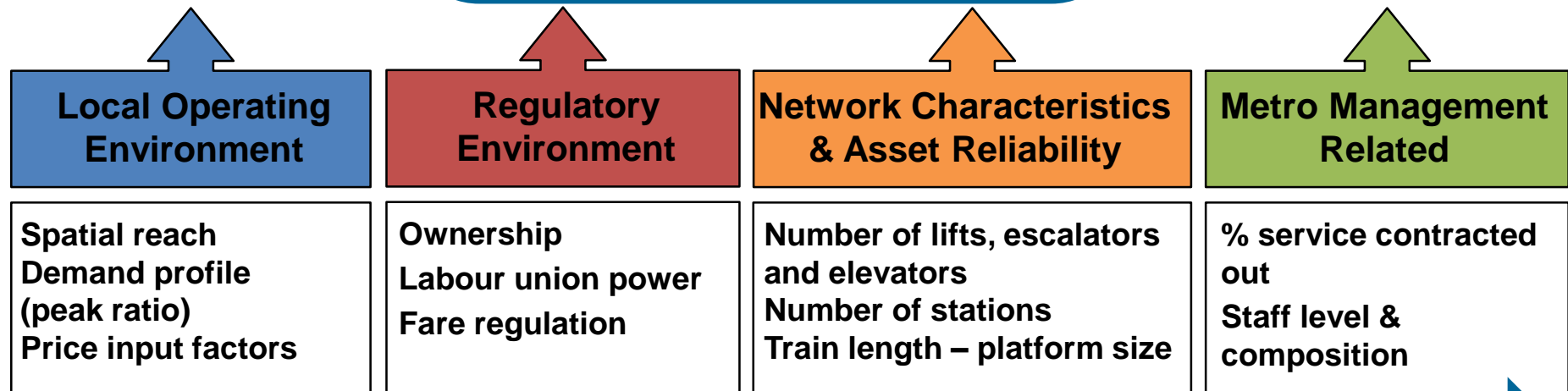


# Factors affecting station service cost efficiency



## Station service operations cost

- Station platform supervision and platform assistants and multifunctional staff.
- Station energy and power consumption
- All staff at ticket offices and gate lines



Degree of Metro Control

# Results – Station Service Costs

+10% change in:	% change in station service cost PER	
	Passenger Journey	Station
Passenger journeys	<b>-12.0%</b>	<b>-16.0%</b>
Number of stations	<b>-6.9%</b>	<b>-1.8%</b>
Station staff hours contracted out	<b>-1.2%</b>	<b>-1.0%</b>
Number of lifts, elevators and travelators	+2.1%	+2.1%
Train length (per metre)	<b>+0.6%</b>	
Age of the system (per year)	<b>+0.2%</b>	<b>+0.2%</b>
Own labour wages	<b>+7.8%</b>	<b>+2.6%</b>
Price of electricity	<b>+2.1%</b>	<b>+2.4%</b>
Time trend	<b>-0.2%</b>	<b>-0.2%</b>

Bold coefficients are statistically significant at a 90% confidence level. Detailed table with all variables and t-values in the paper.

# Key findings – Station Service Costs

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- Very significant economies of density. Most passenger-intensive metros have very low costs per passenger.
- More stations, lower costs: Signalling effect for simple stations.
- Contracting out station staff shows moderate effect at lowering costs.
- Age of the system: older metros tend to have higher station costs. Also older metros located in more expensive cities (cross effect).
- Time trend: decreasing time trend for station service costs.

# Thank You

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# Results – Operating costs aggregate

+10% change in:	% change in total operating cost PER		
	Car km	Passenger Journey	Train hours
Output	<b>-9.0%</b> (car km)	<b>-9.5%</b> (pax journey)	<b>-10.9%</b> (train hours)
Wage	<b>+2.8%</b>	<b>+2.7%</b>	<b>+2.6%</b>
Total staff hours	<b>+4.0%</b>	<b>+4.1%</b>	<b>+4.3%</b>
Network length	+2.1%	+2.5%	2.3%
Number of stations	<b>-2.4%</b>	-2.2%	-2.1%
Incidents per car km	-2.1%	-1.2%	0.0%
% AC Rolling Stock	-1.8%	<b>-2.5%</b>	<b>-2.0%</b>
Age of the system (per year)	<b>0.05%</b>	<b>-0.05%</b>	<b>-0.06%</b>
Time trend	<b>-1.1%</b>	<b>-1.2%</b>	<b>-1.1%</b>

ns: Non-significant; \*\*\* Significant at 1% level; \*\* Significant at 5% level; \*significant at 10% level.