

Université Lumière Lyon 2

Faculté des Sciences Economiques

## Sources of Errors and Biases in Traffic Forecasts for Toll Road Concessions

Thèse pour le Doctorat ès Sciences Economiques

Mention Economie des Transports

**Antonio NUNEZ**

dirigée par M. le Professeur Alain BONNAFOUS

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Membres du Jury:

M. Alain BONNAFOUS	Pr. à l'IEP de Lyon	<i>Directeur</i>
M. Yves CROZET	Pr. à l'Université Lyon 2	
M. Jean DELONS	Chargé de Mission à Cofiroute	
M. Fabien LEURENT	Pr. à l'ENPC	
M. Werner ROTHENGATTER	Pr. à l'Université de Karlsruhe	<i>Rapporteur</i>
M. Stéphane SAUSSIER	Pr. à l'Université de Paris 11	<i>Rapporteur</i>

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# Appendix C

## VTTS survey form



Local : Sorigny (barrière – vers Tours)	Ancenis (barrière – vers Nantes)
N10 (vers Tours)	N138 (Alençon – sens Sud-Nord)
Enquêteur :	

Présentation de l'enquête ....

**Quel était votre dernier lieu de chargement ou déchargement ?**  
 (where are you comming from ? donde ha usted empezado este viaje ? de onde procede esta viagem ?)

**Quel sera votre prochain lieu de chargement ou déchargement ?**  
 (where are you going to ? donde va usted? Para onde vai ?)

**Avec quelle fréquence vous faites ce trajet ?** \_\_\_\_\_ fois par semaine      \_\_\_\_\_ fois par mois  
 (with what frequency do you make this journey ?  
 con que frecuencia hace usted este trayecto ?  
 com qual frequencia voce realiza este trajeto ?)

**Votre entreprise travaille pour :**  
 (your company works mainly for  
 su empresa trabaja mas por  
 sua empresa trabalha principalmente por )

**Compte d'autrui**  
 Hire  
 cuenta ajena  
 conta de outrém

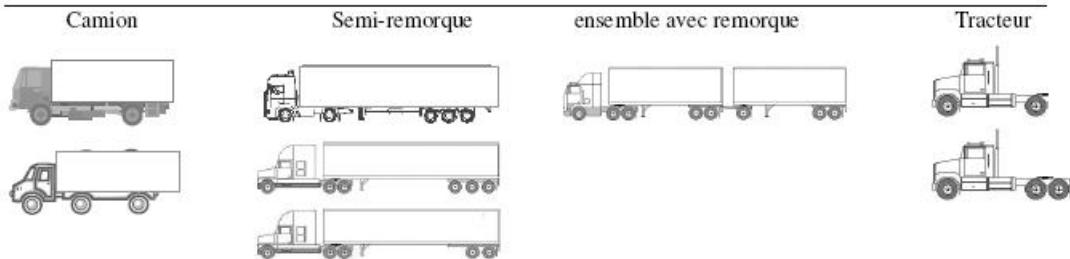
**Compte propre**  
 Own account  
 cuenta propia  
 conta propria

**Combien d'employés compte votre entreprise** (number of employees, numero de empleados, numero de empregados)

moins de 5      entre 5 et 10      entre 10 et 50      entre 50 et 100      plus de 100

**Quel type de marchandise transportez-vous ?** (class or kind of commodity, tipo de mercancía, tipo de mercadoria)

Vide	Minerais et déchets
Ne sait pas	Produits métallurgiques
Produits agricoles et animaux vivants	Matériaux de construction et minéraux
Produits Alimentaires / boissons	Engrais
Produits périsposables / réfrigérés	Produits chimiques
Combustibles / produits pétroliers	Matériel de transport / agricole/ machines
Électroniques/électroménager/informatique/	Papier
Vêtement/chaussures	Autres



Pays d'immatriculation : FR      autre : \_\_\_\_\_

Figure C.1: VTTS survey form