


## CALIBRATING FUEL CONSUMPTION AND EMISSION MODELS FOR MODERN VEHICLES

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## Fuel Consumption and Emission Models

Estimation of **fuel consumption** and **emissions** for evaluating traffic conditions is useful for environmental assessment in traffic design, operations and planning. This also forms the basis of **operating cost** modelling.

Fuel consumption and emission (**CO<sub>2</sub>**, **CO**, **HC**, **NO<sub>x</sub>**) models of **four levels of aggregation** were developed by the first author and his colleagues at the Australian Road Research Board in the 1980s:

- **instantaneous (second-by-second)**
- **four-mode elemental (modal)**
- **running speed (& PKE)**
- **average speed**

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## HISTORY

### KEY REFERENCES (available on sidrasolutions.com)

AKÇELIK, R. (1983). Progress in Fuel Consumption Modelling for Urban traffic Management. ARRB Research Report **ARR No. 124**.

AKÇELIK, R. and BIGGS, D.C. (1987). Acceleration profile models for vehicles in road traffic. Transportation Science.

BOWYER, D.P., AKÇELIK, R. and BIGGS, D.C. (1985). Guide to Fuel Consumption Analysis for Urban Traffic Management. ARRB Special Report **SR No. 32**

### US AWARD

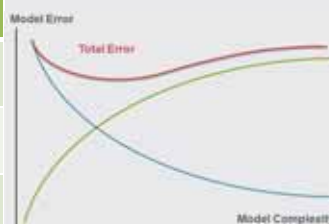
ITE (USA) 1986 **Transportation Energy Conservation Award** in Memory of Frederick A. Wagner for research into energy savings from urban traffic management.



## Traffic - Transport Model Hierarchy (from SR 32)

### Appropriate fuel and emission model

Traffic - Transport Model	Examples	Fuel and Emission Model
Macro	VISUM, CUBE, EMME	Average Speed
Macro - Meso	SATURN, TRANSYT	Running Speed, Three-mode Elemental
Micro - Meso	SIDRA INTERSECTION	Four-Mode Elemental
Micro	SIDRA TRIP, VISSIM	Instantaneous



## Fuel Consumption and Emission Models

- **Four-mode elemental (modal) model:**  
**SIDRA INTERSECTION**
- **Instantaneous (second-by-second) model:**  
**SIDRA TRIP**

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## SIDRA INTERSECTION: Micro-analytical traffic evaluation tool



First released in 1984.  
Current version: SIDRA INTERSECTION 5.1

Working towards: Version 6  
(including SIDRA NETWORK)

8200 licences in 1300 organisations across  
in 68 Countries

Four-mode elemental model using  
SIDRA INTERSECTION vehicle path (drive cycle) model

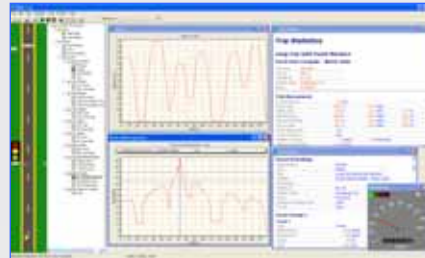
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## SIDRA TRIP: Single trip microsimulation



Vehicle Trip Assessment Software for GPS Data and Quick Scenario Analysis



Instantaneous model

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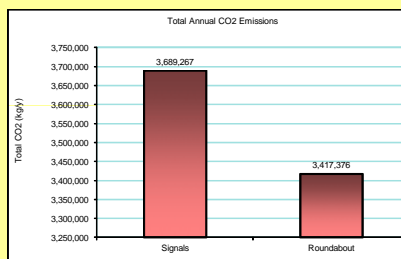
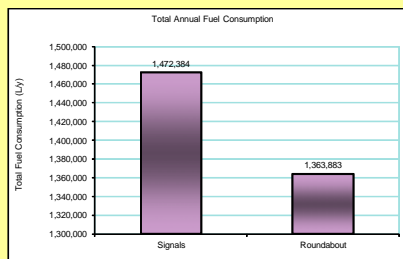


## SIDRA INTERSECTION ANNUAL SUMS Excel application

Option / Scenario	Short Caption
A	Signals
B	Roundabout

Comparison of Fuel, Emissions and Cost for alternative intersection treatments

Annual Values	Cost & Fuel		Emissions (Total)				Demand Flows (Total)			Delay (Total)		
	Cost \$/y	Fuel Ly	CO2 kg/y	HC kg/y	CO kg/y	NOX kg/y	Vehicles veh/y	Pedestrians ped/y	Persons pers/y	Vehicles veh-hy	Pedestrians ped-hy	Persons pers-hy
Signals	9,445,057	1,472,384	3,689,267	5,953	280,252	8,663	17,494,056	0	20,992,868	110,785	0	132,942
Roundabout	7,864,368	1,363,883	3,417,376	5,373	270,088	8,337	17,494,056	0	20,992,868	48,043	0	57,652
Difference (B - A)	-1,580,689	-108,501	-271,891	-580	-10,165	-326	0	0	0	-62,742	0	-75,290
Per cent difference	-16.7%	-7.4%	-7.4%	-9.7%	-3.6%	-3.8%	0.0%	0.0%	0.0%	-56.6%	0.0%	-56.6%



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## SIDRA INTERSECTION ANNUAL SUMS Excel application

Option / Scenario A

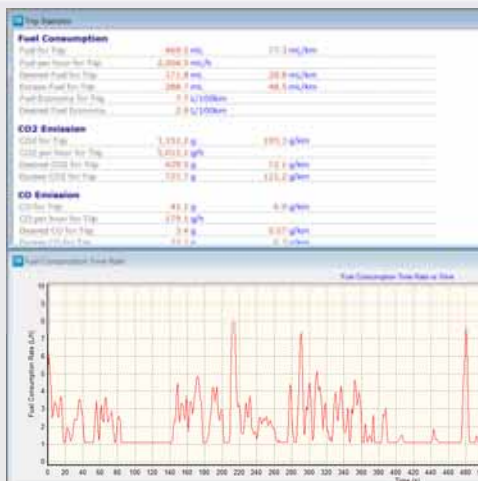
Flow Period	Hours per Year	Cost & Fuel		Emissions (Total)			
		Cost	Fuel	CO2	HC	CO	NOX
		\$/y	L/y	kg/y	kg/y	kg/y	kg/y
1 AM Peak	480	1,148,842	171,692	430,133	708	32,674	1,001
2 PM Peak	480	1,305,918	183,259	459,251	759	33,314	1,030
3 Business Hours	3160	4,846,641	773,759	1,938,759	3,120	149,891	4,613
4 Medium Off-Peak	2200	1,618,293	259,328	649,782	1,033	48,795	1,527
5 Light Off-Peak	2440	525,362	84,346	211,343	333	15,578	492
<b>Total per Year &gt;&gt;</b>	<b>8,760</b>	<b>9,445,057</b>	<b>1,472,384</b>	<b>3,689,267</b>	<b>5,953</b>	<b>280,252</b>	<b>8,663</b>
1 % of Total >>	5%	12%	12%	12%	12%	12%	12%
2 % of Total >>	5%	14%	12%	12%	12%	12%	12%
3 % of Total >>	36%	51%	53%	53%	52%	53%	53%
4 % of Total >>	25%	17%	18%	18%	17%	17%	18%
5 % of Total >>	28%	6%	6%	6%	6%	6%	6%

75% of Fuel,  
Emissions and  
Cost is outside  
AM & PM Peak  
periods

Option / Scenario B

Flow Period	Hours per Year	Cost & Fuel		Emissions (Total)			
		Cost	Fuel	CO2	HC	CO	NOX
		\$/y	L/y	kg/y	kg/y	kg/y	kg/y
1 AM Peak	480	961,139	162,327	406,666	657	33,220	1,002
2 PM Peak	480	995,724	169,611	425,042	683	34,874	1,051
3 Business Hours	3160	4,090,849	715,368	1,732,443	2,812	141,863	4,384
4 Medium Off-Peak	2200	1,373,331	239,533	600,183	927	45,868	1,443
5 Light Off-Peak	2440	443,325	77,043	193,043	294	14,263	457
<b>Total per Year &gt;&gt;</b>	<b>8,760</b>	<b>7,864,368</b>	<b>1,363,883</b>	<b>3,417,376</b>	<b>5,373</b>	<b>270,088</b>	<b>8,337</b>
1 % of Total >>	5%	12%	12%	12%	12%	12%	12%
2 % of Total >>	5%	13%	14%	12%	19%	13%	13%
3 % of Total >>	36%	52%	52%	52%	52%	53%	53%
4 % of Total >>	25%	17%	18%	18%	17%	17%	17%
5 % of Total >>	29%	6%	6%	6%	5%	5%	5%

## SIDRA TRIP Before – After Assessments using GPS data



## Instantaneous Model of Fuel Consumption

$$f_t = \alpha + \beta_1 P_T + [\beta_2 a P_i]_{a>0} \quad \text{for } P_T > 0$$

$$= \alpha \quad \text{for } P_T \leq 0$$

$f_t$  = fuel consumption rate (mL/s),  
 $P_T$  = total tractive power (kilowatts, kW),  
 $P_i$  = inertia component of total power (kW),  
 $\alpha$  = idle fuel consumption rate (mL/s)  
 $\beta_1, \beta_2$  = efficiency parameters

### Simpler Model

$$f_t = \alpha + \beta_1 P_T \quad \text{for } P_T > 0$$

$$= \alpha \quad \text{for } P_T \leq 0$$

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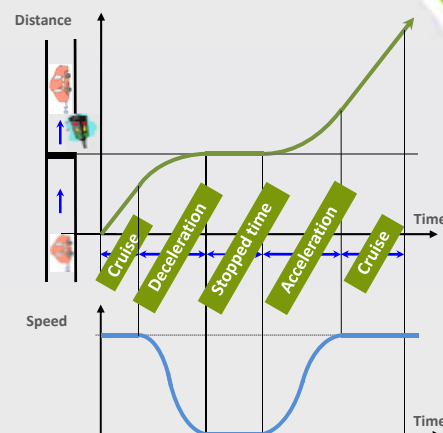
## Four-Mode Elemental Model

### Vehicle path (drive cycle) model for

- Fuel Consumption
- Emissions: CO<sub>2</sub> / CO / HC / NO<sub>x</sub>
- Operating COST

Integral functions are used for each element (mode) of vehicle path:

- Cruise
- Deceleration
- Idling
- Acceleration



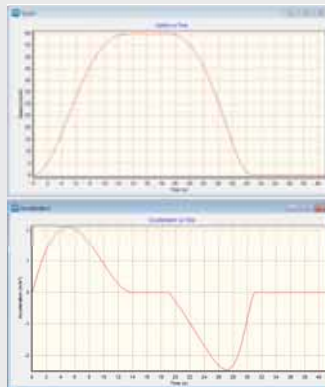
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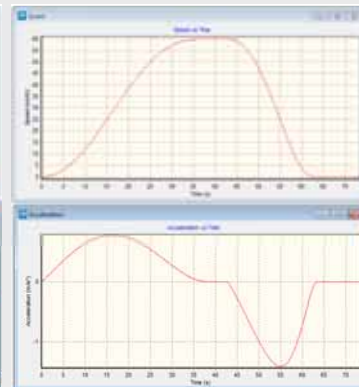
## Acceleration – Deceleration models

### Polynomial acceleration profile model

Light Vehicles



Heavy Vehicles



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## Model Calibration

Vehicle parameters are being calibrated using data for a modern vehicle fleet.

Empirical database (**NISE 2**) incorporating a large range of fuel consumption and emission data for about **400 vehicles** representing a cross section of typical vehicles on **Australian** metropolitan roads is being used.

Data were collected in a vehicle emissions test laboratory using a real-world driving cycle called **CUEDC-P** (Composite Urban Emission Drive Cycle for Petrol vehicles) developed from Australian driving pattern data collected in the field.

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## Test Vehicle

The paper describes the models and the **calibration method** used, and presents results for a **medium-size passenger car**:

### Toyota Corolla Ascent 2004

Mass = 1250 kg

Max. Power = 100 kW

4 cylinder petrol engine

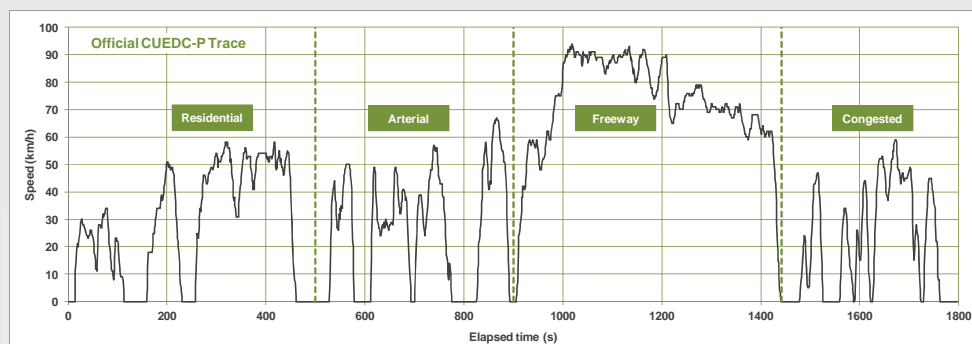
ADR79/00 certified

automatic transmission



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## Official CUEDC-P Speed-Time Profile



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## CALIBRATION RESULTS

Comparison of fuel consumption model parameters for **Toyota Corolla** and **SIDRA TRIP default passenger car**

Param.	Description	Units	SIDRA TRIP P.C.	Toyota Corolla	Diff.
$M_v$	Average vehicle mass	kg	1250	1250	0%
$P_{max}$	Maximum power	kW	80	100	25%
$f_i$	Idle fuel consumption rate	mL/h	1300	889	-32%
A	Drag fuel consumption parameter (rolling resistance)	mL/km	20.0	12.2	-39%
B	Drag fuel consumption parameter (aerodynamic drag)	(mL/km)/(km/h) <sup>2</sup>	0.0050	0.0036	-28%
$\beta_1$	Efficiency parameter	mL/kJ	0.0900	0.0926	3%
$\beta_2$	Energy-acceleration eff. parameter	mL/(kJ.m/s <sup>2</sup> )	0.0300	NA	NA

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## Comparison with current default model results

The test car (Toyota Corolla) is significantly more efficient indicating **19% lower fuel consumption and CO<sub>2</sub>** emission estimates (using the same CO<sub>2</sub> to fuel consumption rate,  $f_{CO_2} = 2.35$  g/mL) for the overall drive cycle (all segments).

The preliminary results indicate that all emissions (CO, HC and NO<sub>x</sub>) are also substantially lower.

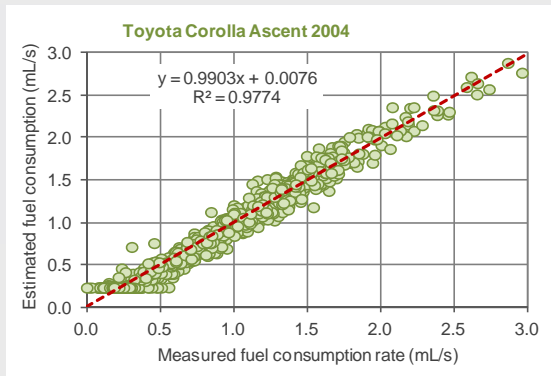
These results are as expected due to technological improvements in the vehicle fleet since the 1980s.

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## Calibration Quality

Estimated vs measured instantaneous fuel consumption rates

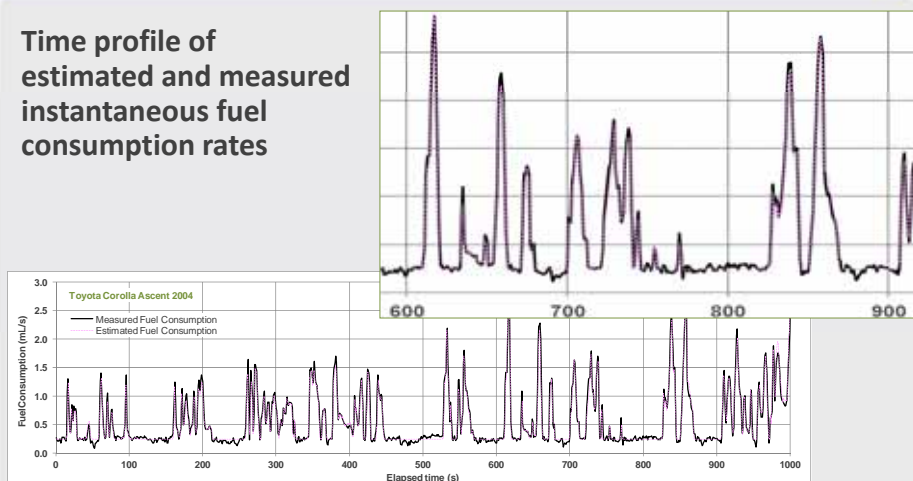


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## Calibration Quality

Time profile of estimated and measured instantaneous fuel consumption rates



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## Calibration Quality

Using the calibrated test vehicle parameters, fuel consumption rates were **estimated with high accuracy** :

- instantaneous values:  
differences in the range **-0.4 mL/s to +0.4 mL/s**
- total values for the drive cycle:  
total error **2.4 mL (0.2%)**

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## Calibration Quality

When the calibration parameters optimised for the overall drive cycle were used for estimating fuel consumption and CO<sub>2</sub> emission for the **Residential, Arterial, Freeway** and **Congested** speed-profile segments, both instantaneous values and the total values were still highly accurate:

- **3% error** for the Freeway segment
- **-2% error** for the Residential, Arterial and Congested segments together

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## CONCLUDING REMARKS

As expected, significant differences have been found in fuel consumption and emission model parameters for the medium-size test vehicle compared with parameters established in the 1980s.

Similar results have been obtained for a **large passenger car** (not presented in this paper).

Work is in progress for calibrating the fuel consumption and emission model described in this paper using data for a large number of vehicles. The results will be made available in due course.

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## CONCLUDING REMARKS

While the reliability of fuel consumption estimates has been found to be very high, **large variability** has been observed in estimates obtained from **emission models** optimized for the overall drive cycle.

Although the errors in estimates of total emission for the whole drive cycle were small (in the range **7% to 10%**), rather **large errors** were found in total emission values when applied to **shorter segments**.

This will be the subject of further investigation.

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END OF PRESENTATION

*Thank you!*

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