# Lecture 12: Fuel, Energy Demand, and Emissions

- 12.1 Overview
- 12.2 Speed-Profile Emission Models
- 12.3 Modal Emission Models
- 12.4 Physics-Based Modal Consumption Model
- 12.5 Electric Vehicles: Energy Consumption and Range

# 12.1 General Problem Setting

- Models for fuel consumption, CO<sub>2</sub>, and other emissions (NO<sub>x</sub>, particulate matter) have the same structure, so all emission factors can be discussed together
- Strict proportionality between fuel consumption and CO<sub>2</sub> emissions:
  - ► Gasoline (98 ROZ): 2.39 kg CO<sub>2</sub>/liter
  - Diesel fuel: 2.69 kg CO<sub>2</sub>/liter

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Traffic Flow Dynamics

- The difference is mainly due to the different specific masses. Essentially, one carbon atom (12 au) produces one CO<sub>2</sub> molecule (44 au), so the mass ratio is about 44/12
- The output can be either local emission factors (per distance, e.g.liters/100 km) or instantaneous factors, e.g., liters/h. (Always use SI in simulations!)
- Input may be on the link level (not considered here) or local level
- As for traffic flow dynamics, local fuel/emission models can be macroscopic or microscopic
- We will concentrate on microscopic models

## Fuel/emissions model overview



## **12.2 Speed-Profile Emission Models**

The input of **speed-profile models**, also known as **cycle-variable models**, are speed profiles of single vehicles from floating-car data, trajectory data, test cycles, or by a microscopic traffic flow simulation together with vehicle attributes. The output are emissions/emission factors during the duration of the speed profile

- In contrast to modal models, the speed profile is not used directly but aggregated into several speed profile factors x
- Most approaches use multivariate linear models for estimating the instantaneous emission vector e:

 $e = \mathsf{L} \cdot x$ 

- The matrix components L<sub>nm</sub> (to be calibrated) describe the influence of speed profile factor m on emission type n
- Speed-profile factors  $x_m$ : fraction of time in a speed class, acceleration standard deviation, ...
- Emission factors:  $e_n$ : CO<sub>2</sub>, NO<sub>x</sub>, PM, ...

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# Some speed-profile factors

Factor	Effect on $CO_2$ emissions
Constant of value 1	intercept (+++)
Fraction of time in speed class 0-25 km/h	++
Fraction of time in speed class 50-75 km/h	
Fraction of time in speed class 75-100 km/h	-
Fraction of time in speed class $> 125{ m km/h}$	++
Standard deviation of speed	+
Average and standard deviation of acceleration	+
Average and standard deviation of deceleration	-
Frequency of acceleration-deceleration cycles	+
Fraction of time the vehicle is standing	+
Fraction of time the vehicle needs power near its maximum power	++
Fraction of road gradients greater than 5 $\%$	+
Engine speed (crankshaft revolution rate) 1 000 - 2 000 rpm	
Engine speed (crankshaft revolution rate) $> 3500$ rpm	++

# 12.3 Modal Emission Models

As speed-profile models, **modal emission models** make use of trajectory information but they use them instantaneously and directly: the emission *rate* is an instantaneous function of the **mode** of vehicle operation: speed, acceleration, road gradient etc

- In the more refined modal models, the vehicle operation mode is complemented by a characteristic map describing the instantaneous operating mode of the engine in form of fuel and emission rates.
- Depending on the model complexity, further input is necessary including altitude, air temperature, and variables related to the engine history (e.g., engine temperature)
- Perfectly suited to microscopic traffic flow models

Traffic Flow Dynamics

- Output: The rates \u00ec<sub>n</sub> of the emission factors (\u00ec<sub>1</sub>: fuel consumption/CO<sub>2</sub> emission rate, ...)
- Two conceptional types: phenomenological models and physics-based models

## Variants of modal emission models

## Phenomenological models

Statistical modal models are based on *regression* including phenomenological interaction terms as factors. For example, for  $\dot{C} = \dot{e}_1$ 

$$\dot{C} = \max\left(0, \ \beta_0 + \beta_1 v + \beta_2 v^2 + \beta_3 v^3 + \beta_4 v \dot{v} + \beta_5 v^2 \dot{v} + \ldots\right).$$

Map-based models. These are based on lookup-tables obtained from real driving experiments (*f*: engine speed):

$$\dot{C} = f(v, \dot{v}, f)$$

- Parameter-free but the driving experiments to generate the lookup tables are very cumpersome
- No transfer/generalisation ability. Each vehicle/engine combination needs its own lookup table

**Physics-based models** are based on *first principles*  $\Rightarrow$  perfect generalisation ability, even to battery-electric vehicles. Two types:

purely analytical

hybrid with an engine characteristic map: lookup table generated on test benches

## 12.4 A Physics-Based Modal Consumption Model



## **Driving resistance**

$$F(v, \dot{v}, \phi) = m_{\mathsf{dyn}} \dot{v} + (\mu + \phi)mg + \frac{1}{2}c_d \rho A v^2$$

- ▶ Inertial force  $m_{dyn}\dot{v}$  with the dynamical mass  $m_{dyn}$  (static mass m + twice the ratio between rotational energy of all rotating parts and  $v^2$ , can be up to  $m_{dyn} = 1.5 m$  for the first gear)
- Solid-state friction force  $mg\mu$  ( $g = 9.81 \,\mathrm{m/s^2}$ , friction coefficient  $\mu \approx 0.015$ )
- Gravitational force of sloping roads  $mg\phi$  with the uphill gradient  $\phi$  (an uphill/downhill road gradient of 10% will mean  $\phi = \pm 0.1$ )

• Wind drag  $\frac{1}{2}c_d\rho Av^2$ 

- c<sub>d</sub>: drag coefficient (about 0.3 for normal cars)
- $\rho$ : air density (about  $1.3 \, \mathrm{kg/m^3}$  at sea level)
- A: frontal cross section (about  $2 \text{ m}^2$ )

## Engine/power management

Instantaneous overall power demand:

 $P_{\mathsf{inst}} = P_{\mathsf{drive}} + P_0 = F \, v + P_0$ 

- $P_{drive} = F v$ : power to overcome the driving resistance
- $\triangleright$   $P_0$ : power to drive all the electric appliances and to overcome internal engine friction

Several power management options:

Old vehicles without overrun fuel cutoff:

 $P = P_0 + \max(P_{\mathsf{drive}}, 0)$ 

Contemporary internal combustion vehicles (ICVs) with overrun fuel cutoff:

$$P = \max(P_0 + P_{\mathsf{drive}}, 0) = \max(P_{\mathsf{inst}}, 0)$$

 Vehicles with recuperation ability including battery-electric vehicles (BEV): see Section 12.5

#### Questions

- ? Without engaged gear (engine idling,  $P_0$  taken from the starter or driving battery) and without braking, a car just starts to roll on a gentle downhill slope of 1.5% and reaches a very slow terminal speed. Determine the friction coefficient  $\mu$
- ! With disengaged clutch and no brakes, no driving resistance can be sustained, so F = 0. After reaching the slow terminal speed,  $\dot{v} = 0$  and the air-drag term is negligible (because of the slow speed). So, with  $\phi = -0.015$ , we have  $\mu + \phi = 0$  or  $\mu = -\phi = 0.015$
- ? On a 3.5% downhill slope, the same idling car reaches a terminal speed of 108 km/h with no brakes. Estimate its  $c_d$  value for  $m = 1\,600 \,\mathrm{kg}$  and  $\rho A = 2 \,\mathrm{kg/m}$
- ! We still have F = 0 and  $\dot{v} = 0$ , so solving the driving resistance equation for  $c_d$ , we obtain

$$c_d = \frac{-2(\mu + \phi)mg}{\rho Av^2} = \frac{0.04 * 1\,600 * 9.81}{2 * 30^2} = 0.33$$

- ? How many kWh mechanical energy are needed for driving 100 km at a constant speed of 100 km/h on a level road? (parameters as above and  $P_0 = 2 \text{ kW}$ )
- ! Just insert in any of the three power formulas (neither overrun fuel cutoff nor recuparetation relevant)  $\Rightarrow$  P = 15.1 kw, hence W = 15.1 kWh for the one-hour drive. Notice that, because of not perfect battery and motor efficiencies, the energy demand for a BEV with this specification is higher, see 12.5 below

## Fuel flow and instantaneous consumption per distance unit

Specific consumption (in [kg/J] if C is measured in kg or [I/J] if C measured in liters):

$$C_{\rm spec} = \frac{C}{W_{\rm mech}}$$

Engine efficiency with  $w_{cal}$ : energy density (in [J/kg] if C is measured in kg, in [J/l] if C s measured in l)

$$\gamma = \frac{W_{\rm mech}}{W_{\rm chem}} = \frac{W_{\rm mech}}{w_{\rm cal}C}$$

Relation between  $C_{\text{spec}}$  and efficiency:

$$C_{\rm spec} = \frac{1}{\gamma w_{\rm cal}}$$

(How to derive this?) insert  $C_{mech}$  from the second formula into the first Fuel flow rate:

$$\dot{C} = C_{\rm spec} P$$

How to derive this? just take the time derivative of the rhs. and lhs. of  $C = C_{\text{spec}}W$ 

#### Characteristic engine maps



The efficiency of the **internal combustion engine** of ICVs is highly variable and empirically determined as a **characteristic map** on engine test benches

- x axis: engine speed f, often given in rpm (rotations per minute)
- > y axis: effective motor pressure  $\overline{p}$ : proportional to the engine torque M on the crankshaft:

$$M = \frac{\overline{p}V_{\mathsf{zyl}}}{4\pi}$$

and roughly proportional to how much you push the throttle pedal

Contour lines: specific consumption in kg/kWh or ml/kWh

## Characteristic engine maps with power as independent variable



Power for four-stroke engines with cycle time  $\tau = 1/f$ :  $P = \overline{p}V_{\text{zyl}}/(2\tau)$ :

$$P(f,\overline{p}) = \frac{\overline{p}V_{\mathsf{zyl}}f}{2}$$

Setting equal  $P = M\omega = 2\pi M f$  with the above  $\Rightarrow$  already mentioned torque-pressure relation:

$$M = \frac{P}{2\pi f} = \frac{\overline{p}V_{\text{zyl}}f}{4\pi}$$

### **Efficiency maps**



The contour lines for the specific consumption are simply replaced by efficiency contour lines according to



 $(w_{cal}$  here related to the volume)

## Application 1: Consumption per distance at constant speed



Fuel consumption per  $L = 100 \, \mathrm{km}$  on a level road:

$$\begin{aligned} t_L &= T\dot{C} = \frac{L}{v}\dot{C} = \frac{L}{v}C_{\text{spec}}P \\ &= LC_{\text{spec}}\left(\frac{P_0}{v} + F\right) \\ &= LC_{\text{spec}}\left(\frac{P_0}{v} + \mu mg + \frac{1}{2}c_d\rho Av^2\right) \end{aligned}$$

#### General consumption for any vehicle state



General expression for  $C_L$  including accelerations  $\dot{v}$ , gradients  $\alpha$ , and gears g:

$$C_L = LC_{\rm spec}(f(g,v),P)\frac{P}{v}, \qquad P = P_0 + m_{\rm dyn}\dot{v}v + mg(\mu+\alpha)v + \frac{1}{2}c_d\rho Av^3$$

The engine speed f is proportional to the vehicle speed v and the gear-specific total transmission ratio  $i_g$  between crankshaft and tyre rotation:  $f = i_g v/(2\pi r_{tyre})$  with  $i_g$  between about 15 (1st gear) and 3 (highest gear)

#### General consumption for the fuel-optimal gear



- Generally, several gears are possible for a given vehicle speed and power-demand combination
- In most cases, the highest possible gear is the best one.
- When needing more power at a given speed (uphill gradient, acceleration), a lower gear is often needed, even from a consumption perspective

## Questions

- **?** Assuming a constant specific consumption, derive the speed where a vehicle needs the least fuel per 100 km (no gradient, constant speed)
- ! With constant  $C_{\text{spec}}$ , the consumption rate is directly proportional to the total power,  $\dot{C} \sim P$  and the consumption per distance unit proportional to

$$\frac{P}{v} = \frac{P_0}{v} + \mu mg + \frac{1}{2}c_d A\rho v^2$$

Calculate the argument of the minimum with respect to speed in the usual way

- ? Why are there gray ranges (not possible) in the maps for the fuel-optimal gear
- to much power demand or too high speed  $(f > f_{max}$  even for the highest gear)
- ? Which rule for fuel-economic driving can be derived from the maps
- ! The *sweet spot* is at a rather high effective pressure, i.e., throttle pedal pressure and a low engine speed, so choose the highest gear possible which also means pushing more on the pedal compared to a lower gear (see the power maps)

## **12.5 Electric Vehicles**

Battery-electrical vehicles (BEV) can be analyzed by the above physics-based models. The differences are



- The engine efficiency is no longer the ratio between mechanical and thermal energy but between mechanical and electrical energy
- The characteristic map is two-sided with a nearly symmetrical generator regime
- The motor efficiency is much higher and nearly constant in a wide range but there is an additional battery efficiency for charging/discharging
- ► BEV have only a single gear and no clutch (transmission ratio i<sub>el</sub> ≈ 9)

# Limits/regimes of an BEV electrical motor



- Low engine speeds: maximum torque limited by the maximum current of the electrical motor
- High engine speeds: maximum power limited by motor overheating
- maximum motor speed: limited by the voltage and mechanical parts
- The first two limits can be exceeded for a short time

## Questions on a very small BEV



? Give the maximum torque, the maximum engine speed, and the maximum power

! 
$$M_{\text{max}} = 92 \text{ Nm}, f_{\text{max}} = 9000 \text{ min}^{-1} = 150 \text{ s}^{-1},$$
  
 $P_{\text{max}} = 2\pi f_{\text{max}} 43 \text{ Nm} = 40 \text{ kW}$ 

- ? The BEV has tyres of an effective outer radius of  $r_t = 30 \,\mathrm{cm}$  and a transmission ratio  $i_{\rm el} = 9$ . Give the cutoff speed where the acceleration starts to drop strongly, and the maximum speed
- We have  $v(f) = 2\pi f_t r_t = 2\pi f r_t / i_{el}$  so, with a cutoff engine speed  $f_c = 4500/60 \, \text{s}^{-1} = 75 \, \text{s}^{-1}$ and  $f_{\text{max}} = 2v_c = 150 \, \text{s}^{-1}$ , we have  $v_c = 15.7 \, \text{m/s} = 56 \, \text{km/h}$  and  $v_{\text{max}} = 31.4 \, \text{m/s} = 113 \, \text{km/h}$ .

# **Questions (ctned)**



## ? The BEV from above has

 $m \approx m_{\text{dyn}} = 1\,800 \,\text{kg}$  and  $\mu = 0.015$ . The power  $P_0$  is taken directly from the battery. Give the maximum acceleration

The maximum acceleration is attained near zero speed where air drag is negligible. From the power formula we obtain

$$\dot{v} = P/(mv) - g\mu$$

Since, for  $v < v_c$ , we also have  $P_{\max}(v) = 2\pi M_{\max}f = M_{\max}i_{\rm el}v/r_t$ , speed cancels out, so

$$\dot{v}_{\rm max} = M_{\rm max} i_{\rm el} / (r_t m) - g\mu = 1.7 \,{\rm m/s^2}$$

The comparatively low value is due to this tiny engine. Typically, because of the high torque  $M_{\rm max}$  down to zero engine speed, the BEV accelerations are comparatively high.

# Battery charge/discharge rate

BEVs take the basic power demand  ${\it P}_0$  directly from the battery instead of from the ICV generator:

$$\dot{W}_{\text{batt}} = \begin{cases} \frac{-P_{\text{el}}}{\eta_{\text{batt}}} & P_{\text{el}} \ge 0\\ -\eta_{\text{batt}}P_{\text{el}} & P_{\text{el}} < 0 \end{cases}, \qquad P_{\text{el}} = \begin{cases} P_0 + \frac{P_{\text{drive}}}{\eta_{\text{M}}} & P_{\text{drive}} \ge 0\\ P_0 + \eta_{\text{M}}P_{\text{drive}} & P_{\text{drive}} < 0 \end{cases}$$

- $\dot{W}_{batt}$ : charge/discharge rate of the battery during driving
- $\blacktriangleright$   $P_{\rm drive}:$  just the usual product driving force F times speed v
- $\blacktriangleright$   $\eta_{\rm batt}:$  efficiency of the battery at charging and discharging
- >  $\eta_{M}$ : motor efficiency in both powering and generating mode (characteristic map)
- ▶ The roundturn recuperation efficiency is (neglecting the special case  $(P_{\rm el} > 0) \cap (P_{\rm drive} < 0)$ ):

$$\eta_{\rm rec}=\eta_{\rm batt}^2\eta_{\rm M}^2\approx 0.6$$

## Range

Discharge when driving the distance L at constant speed on a level road:

$$\begin{split} \Delta W_{\text{batt}}(L) &= -P_{\text{batt}}T \\ &= -P_{\text{batt}}L/v \\ &= -\frac{L}{v}\left(\frac{P_0 + P_{\text{drive}}(v, 0, 0)/\eta_{\text{M}}}{\eta_{\text{batt}}}\right) \end{split}$$

How to calculate the needed kWh per 100 km with this formula? Multiply the above formula for  $L = 100\,000 \text{ m}$  with  $1/3\,600\,000 \text{ kWh/Ws}$ 



In spite of recuperation, the discharge per km with changing speeds + stops is higher than when driving at the constand average speed because:

- $\blacktriangleright$  the nonlinearity  $\propto v^3$  of the wind drag increases the average power to overcome it
- recuperation is not perfect
- ► stops add extra depletion  $\Delta W = -T_{stop}P_0/\eta_{batt}$