

# Pengembangan Sistem Routing Dinamis untuk Kendaraan

(Studi Kasus di Kota Surabaya)

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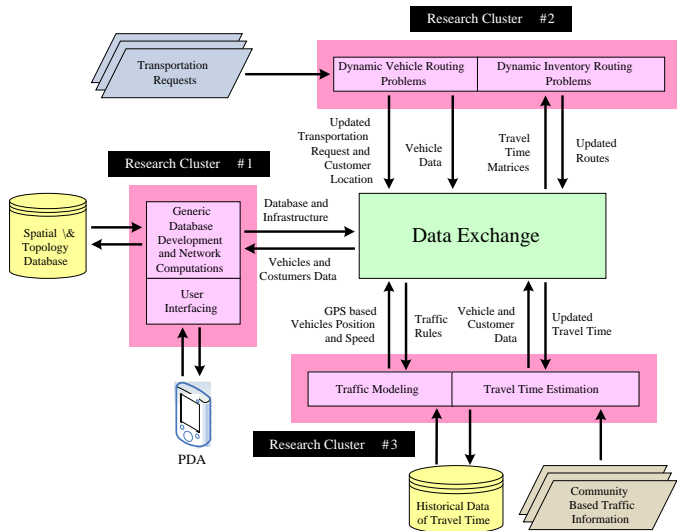
2008

- 1 Mempelajari dan mengembangkan algoritma optimisasi rute transportasi yang dinamis terhadap lamanya perjalanan.
- 2 Mempelajari dan mengembangkan metode estimasi dan prediksi lama perjalanan sehingga rute optimum dapat dicari.
- 3 Membangun sistem tracking kendaraan real-time berbasis GIS.
- 4 Merancang dan membangun sistem pelayanan tracking kendaraan.

**Kelompok #1:** Pengembangan sistem (perangkat lunak) tracking kendaraan berbasis GIS.

**Kelompok #2:** Pengembangan metode-metode optimisasi rute kendaraan dan aplikasinya untuk routing dinamis.

**Kelompok #3:** Estimasi lama perjalanan dan permodelan lalu lintas.



# Kalman Filter Based Freeway Travel Time Estimation

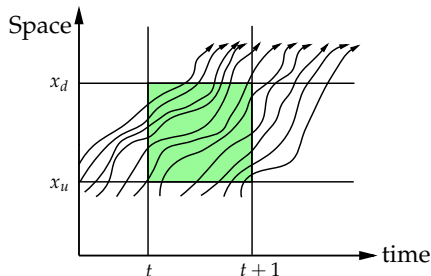
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# Definition of Travel Time Estimation (1)

- Definition: mean travel time within the closed area defined by the time ( $t$  and  $t + 1$ ) and space ( $x_u$  and  $x_d$ ).
- True space-mean speed for vehicles inside the close area equal to total travel distance divided by total travel time of vehicle of vehicles inside closed area.



Gambar: 1

## Definition of Travel Time Estimation (2)

Unbiased estimate of space-mean speed

$$\bar{v} = \frac{\sum_{n=1}^N \{ \min(x_{t+1}^n, x_d) - \max(x_t^n, x_u) \}}{\sum_{n=1}^N \{ \min(t+1, t_d^n) - \max(t, t_u^n) \}}$$

$N$  = number of vehicles traversing the section during the time interval

$x_t^n$  = position of vehicle  $n$  at time  $t$

$x_u$  = position of upstream boundary

$x_d$  = position of downstream boundary

$t_d^n$  = time when vehicle  $n$  passes the downstream boundary

## Definition of Travel Time Estimation (3)

- Average section travel time ( $tt_s$ ) can be estimated from the unbiased estimate of the space-mean speed

$$tt_s = \frac{x_d - x_u}{\bar{v}} = \frac{\Delta x}{\bar{v}}$$

- Equation above can be considered as a "true" mean travel time of the temporal and spatial section.

# Travel Time Estimation Based on Section Density (1)

- Section density model used is based on conservation or continuity equation and it shows the same form as in fluid flow.

$$\frac{\partial q}{\partial x} + \frac{\partial k}{\partial t} = 0$$

$q$  is flow (vehicles/hour),  $k$  is density (vehicles/mile),  $x$  is location, and  $t$  is time.

- If the speed of the traffic fluids is  $v$  basic identity is obtained

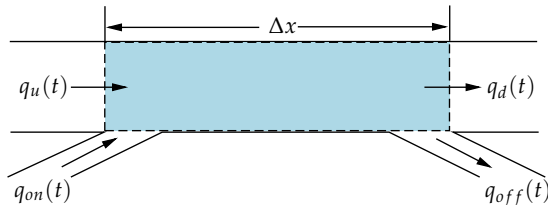
$$q = kv$$

## Travel Time Estimation Based on Section Density (2)

- In urban freeway, freeway section includes one on-ramp and one off-ramp. Traffic flow passing the section during time period  $(t - 1, t)$  can be estimated as

$$q(t) = \alpha[q_u(t) + q_{on}(t)] + (1 - \alpha)[q_d(t) + q_{off}(t)]$$

$\alpha$  is smoothing parameter,  $q_u(t)$  and  $q_d(t)$  are traffic flows of the upstream and downstream boundaries within  $(t - 1, t)$ ,  $q_{on}(t)$  and  $q_{off}(t)$  are total on-ramp and off-ramp traffic flows within  $(t - 1, t)$ .



## Travel Time Estimation Based on Section Density (3)

- Using homogeneity of traffic inside section, an intuitive estimation of the section travel time is

$$tt(t) = \frac{\Delta x}{v(t)} = \frac{\Delta x}{q(t)} k(t) \quad (1)$$

$\Delta x$  is the length of the section between upstream and downstream detectors.

- Based on traffic flow conservation equation, estimation of travel time depends on a non-observable state variable, i.e. section density  $k(t)$ , which can be represented as a time series

$$k(t) = k(t-1) + \frac{1}{L\Delta x} \{ [q_u(t) + q_{on}(t)] - [q_d(t) + q_{off}(t)] \} \quad (2)$$

$L$  is the number of lanes on the mainline freeway.

# Kalman Filter Traffic Flow Estimation (1)

- Equation (1) and (2) are rewritten as

$$\text{State equation: } k(t) = k(t-1) + u(t) + w(t-1)$$

$$\text{Measurement equation: } tt(t) = H(t)k(t) + v(t)$$

- $u(t)$  and  $H(t)$  can be estimated by

$$u(t) = \frac{1}{L\Delta x} \{ [q_u(t) + q_{on}(t)] - [q_d(t) + q_{off}(t)] \}$$

$$H(t) = \frac{\Delta x}{\alpha[q_u(t) + q_{on}(t)] + (1 - \alpha)[q_d(t) + q_{off}(t)]}$$

## Kalman Filter Traffic Flow Estimation (2)

- Section density is treated as a state variable and section travel time as a measurement variable.
- Systematic errors, system and measurement error, are also introduced. State noise  $w(t)$  with mean  $q(t)$  and variance  $Q(t)$  and measurement noise  $v(t)$  with mean  $r(t)$  and variance  $R(t)$ .

Solution to Kalman filter problem is

$$\bar{k}(t) = \hat{k}(t-1) + u(t) + q(t-1)$$

$$\bar{P}(t) = \hat{P}(t-1) + Q(t-1)$$

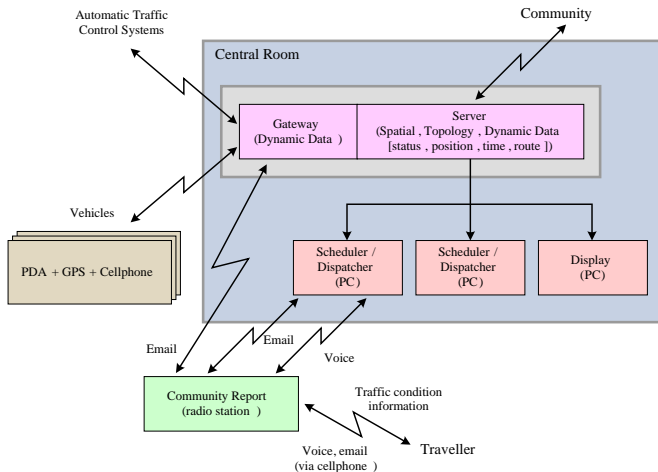
$$G(t) = \bar{P}(t)H(t)^T \left[ H(t)\bar{P}H(t)^T + R(t) \right]^{-1}$$

$$\hat{k}(t) = \bar{k}(t) + G(t)[tt(t) - H(t)\bar{k} - r(t)]$$

$$\hat{P}(t) = \bar{P}(t) - G(t)H(t)\bar{P}(t)$$

- Including community information to adjust traffic flow estimation.
- Software development for GIS based vehicle tracking system
- Dynamic routing optimization using Ant Colony

# Current Work



- Lianyu Chu and Jun-Seok Oh, "Adaptive Kalman Filter Based Freeway Travel Time Estimation", 84<sup>th</sup> annual meeting of Transportation Research Board, 2005
- Congwei Hu, Wu Chen, Yongqi Chen and Dajie Liu, "Adaptive Kalman Filtering for Vehicle Navigation", Journal of Global Positioning Systems Vol. 2, No. 1, pp: 42-47, 2003
- R. G. Brown and P. Y. C. Hwang, "Introduction to Random Signals and Applied Kalman Filtering", John Wiley & Sons, 3<sup>rd</sup> Ed, 2002
- Carlos F. Daganzo, "Fundamentals of Transportation and Traffic Operations", Pergamon Press, 1997