

# Adaptive Contact Probing Mechanisms for Delay Tolerant Applications

Wang Wei, Vikram Srinivasan, Mehul Motani



# Outline

- **Introduction**
- **Modeling contact processes**
- **Real world contact traces**
- **Designing energy efficient probing algorithm**
- **Conclusion**

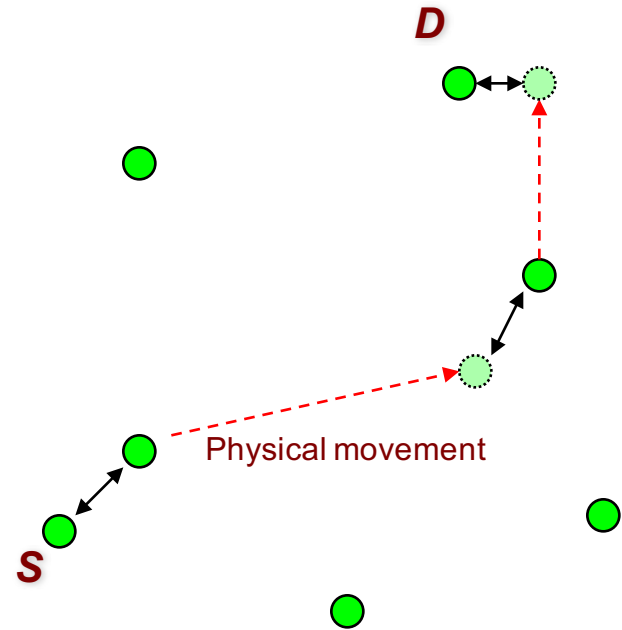
# Delay tolerant network

## ▪ Features:

- A end-to-end path may not always exist at any time
- The round-trip time may be extremely long
- Mobile nodes exchange data when they meet each other

## ▪ Examples

- Dating applications
- Advertisement



# Energy consumption of DTN

- **Communication in DTN is based on neighbor discovery**
- **Mobiles are normally battery powered**
- **Continuously search for data exchange opportunities can quickly exhaust the battery**

- **Example**

- Bluetooth discovery process consumes as much energy as phone calls on mobile phones

- With discovery interval of 30 seconds, mobile phone need to recharge more than one times per day

# Energy efficient neighbor discovery

- **Goal**

- Reduce the energy used in neighbor discovery, while not missing too many contacts*

- **Assumptions**

- Each probe cost the same amount of energy*

- Reduce energy → Reduce the number of probes

- Probes are impulses in time*

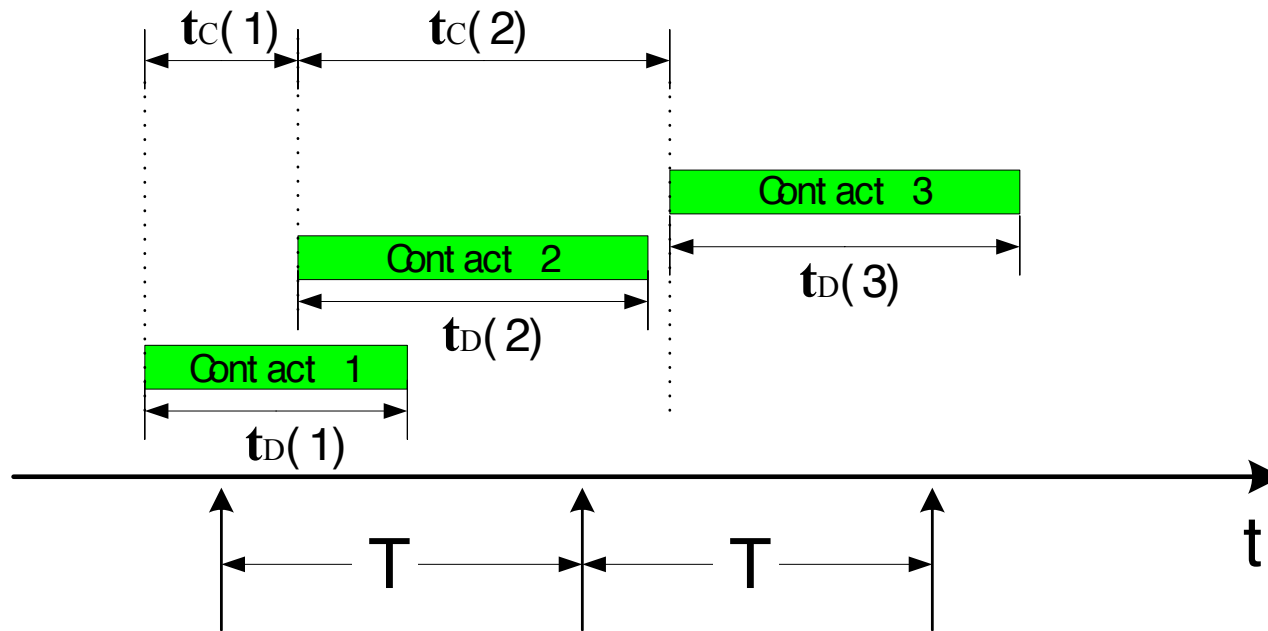
- Probes can find all contacts within communication range*

- **Method**

- Modeling and analysis of contact process*

- Study the real world contact pattern*

# Contact model



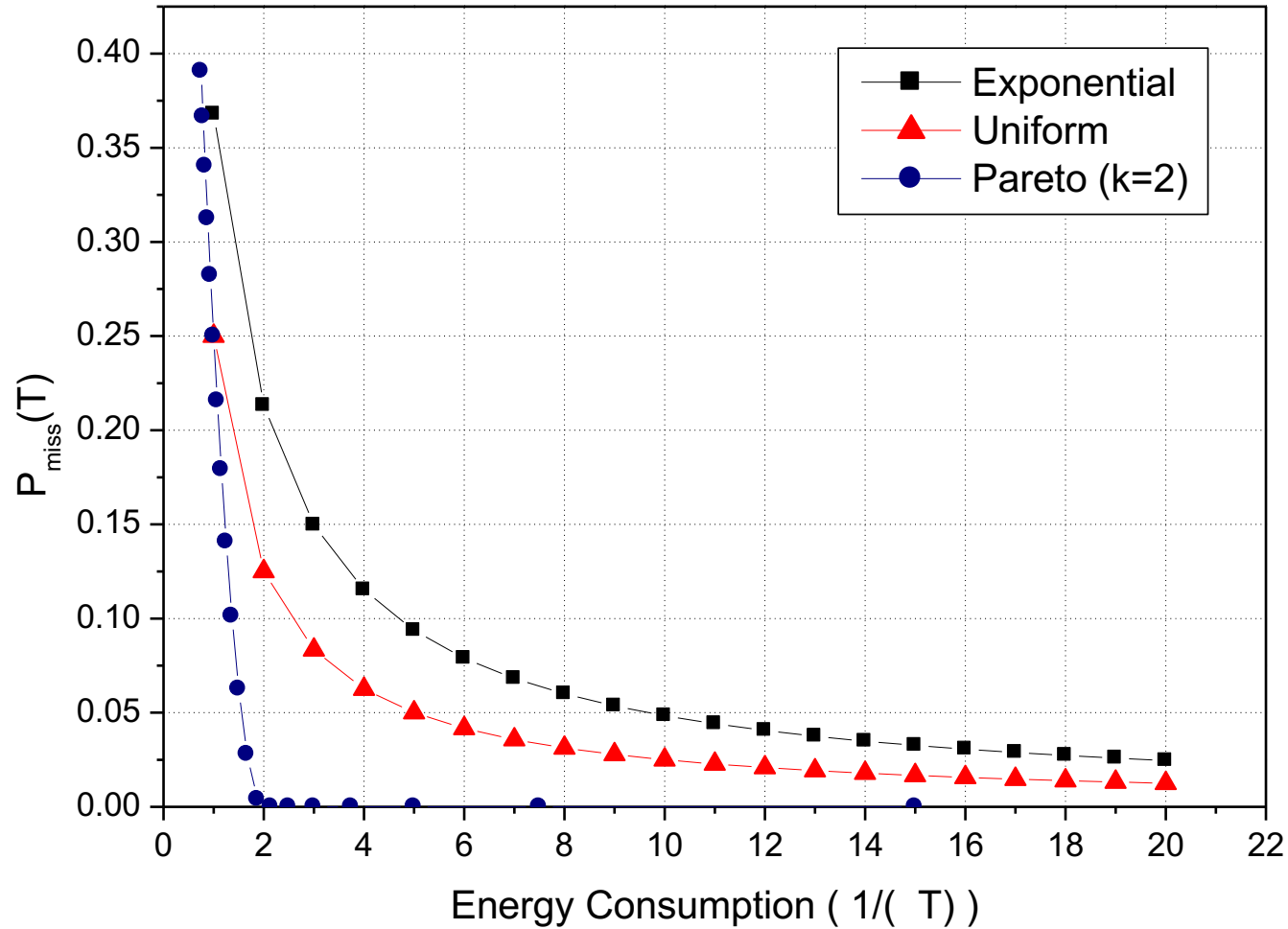
- The contact model from the perspective of one device
- Abstracted as a process with *i.i.d. contact duration* distribution and *inter-contact time* distribution
- Enables methods to analysis the process

# Missing probability

- If the device do not probe during the contact duration, the contact will be *missed*
- If the device has no information about the contact process, using constant probing interval is the optimal solution
- If the contact arrival rate is not changing with time, then the missing probability is only related to the contact duration distribution and probing interval, *irrespective* to the contact arrival rate

$$P_{miss}(T) = \frac{1}{T} \int_0^T F_D(x) dx$$

# Missing probability vs. Energy





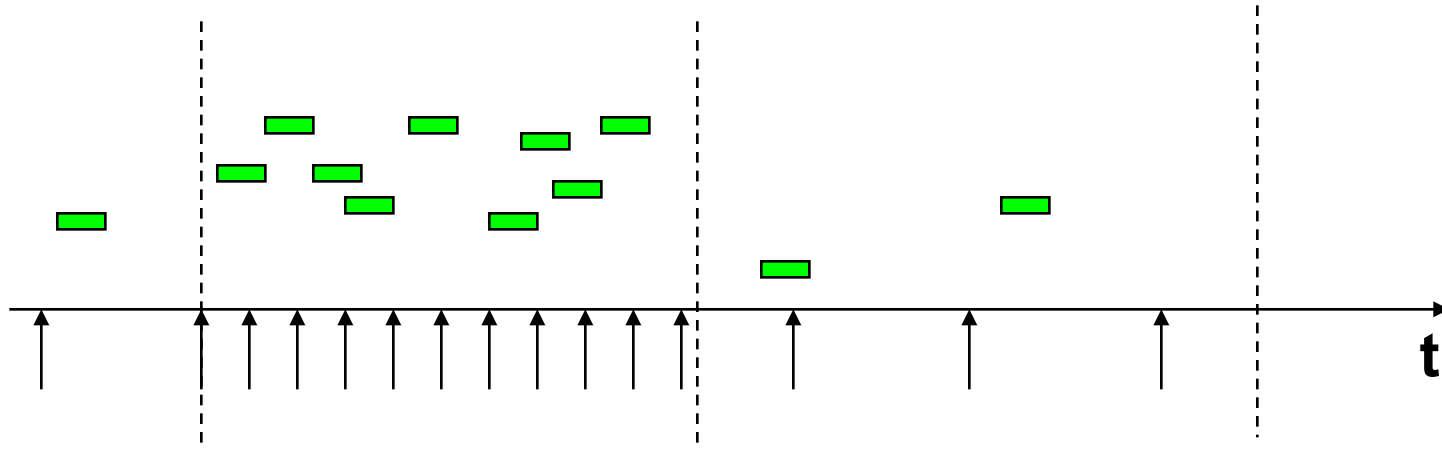
# Missing probability

- The device cannot precisely measure the missing probability
- We can infer the missing probability through the *short contacts* detected by the device
- For given contact duration distributions, such as uniform, exponential and Pareto distribution, we directly calculate missing probability and short contact probability when given the probing interval

# Adaptive scheme I

- Adapt to the contact distribution
- Observe the short contact probability and adapt the probing interval
- Works for slowly varying processes
- Can guarantee a hard contact missing probability over all time durations

# Time-varying contact arrival rate



- When the contact arrival rate is **time-varying** and we **can predict** the arrival rate, we can also adapt to the contact arrival rate
- Use high probing frequency when the contact arrival rate is high, so that can be catch most contacts
- Overall, the missing probability will be minimized

# Optimal probing interval

- Formulated as convex optimization problem

$$\begin{aligned} & \text{Maximize} && \sum_i (1 - P_{miss}(T_i)) \\ & \text{s.t.} && \sum_i \frac{L}{T_i} < N \\ & && T_i \geq 0 \end{aligned}$$

- Assume that the contact duration distribution is stationary. The optimal probing interval can be derived when the arrival rates are known

$$T_i^{*2} P'_{miss}(T_i^*) = \frac{c}{i}$$

# Adaptive scheme II

- Predict the contact arrival rate
- Solve the equation

$$T_i^{*2} P'_{miss}(T_i^*) = \frac{c}{i}$$

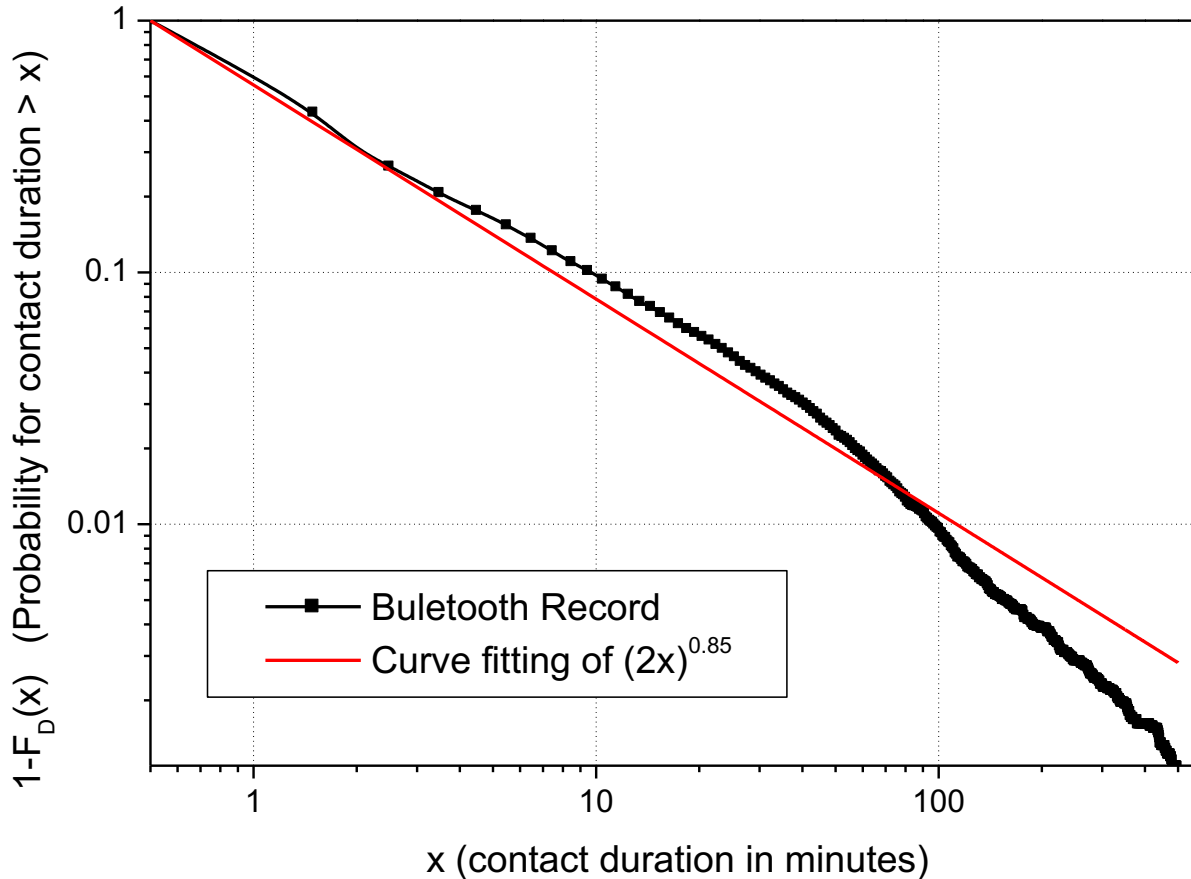
to find the optimal probing interval for a given duration

- Optimize the long-term missing probability and energy tradeoff
- Short term missing probability is high

# Real world contact logging

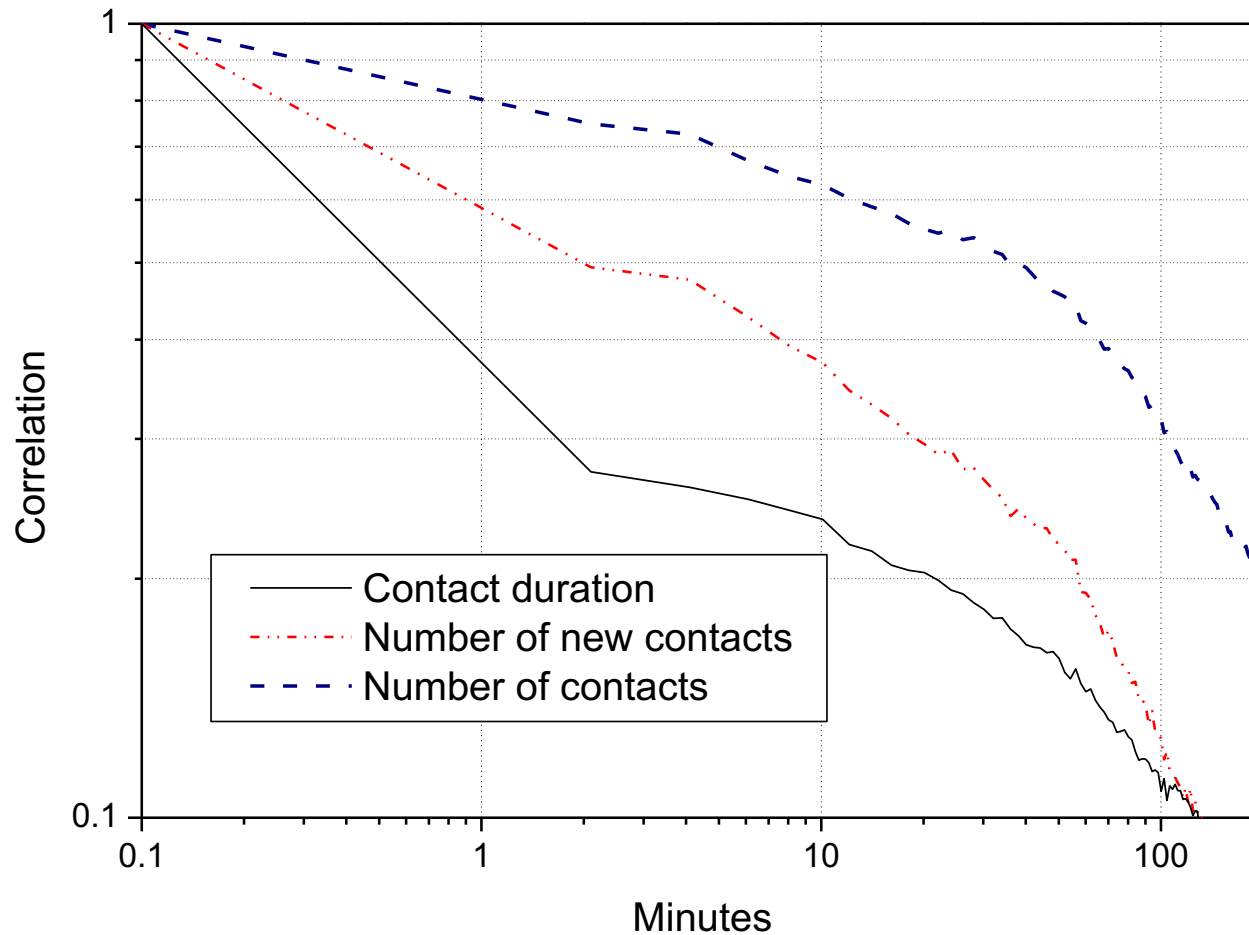
- Use Bluetooth Mobiles carried by 9 volunteers
- Discovery interval is 30 seconds, 24/7
- Collected data for 3 months, totally 12,332 unique devices are discovered
- Data can be used for both analysis and simulation

# Contact duration distribution



- Contact duration distribution is Pareto with  $k=0.85$

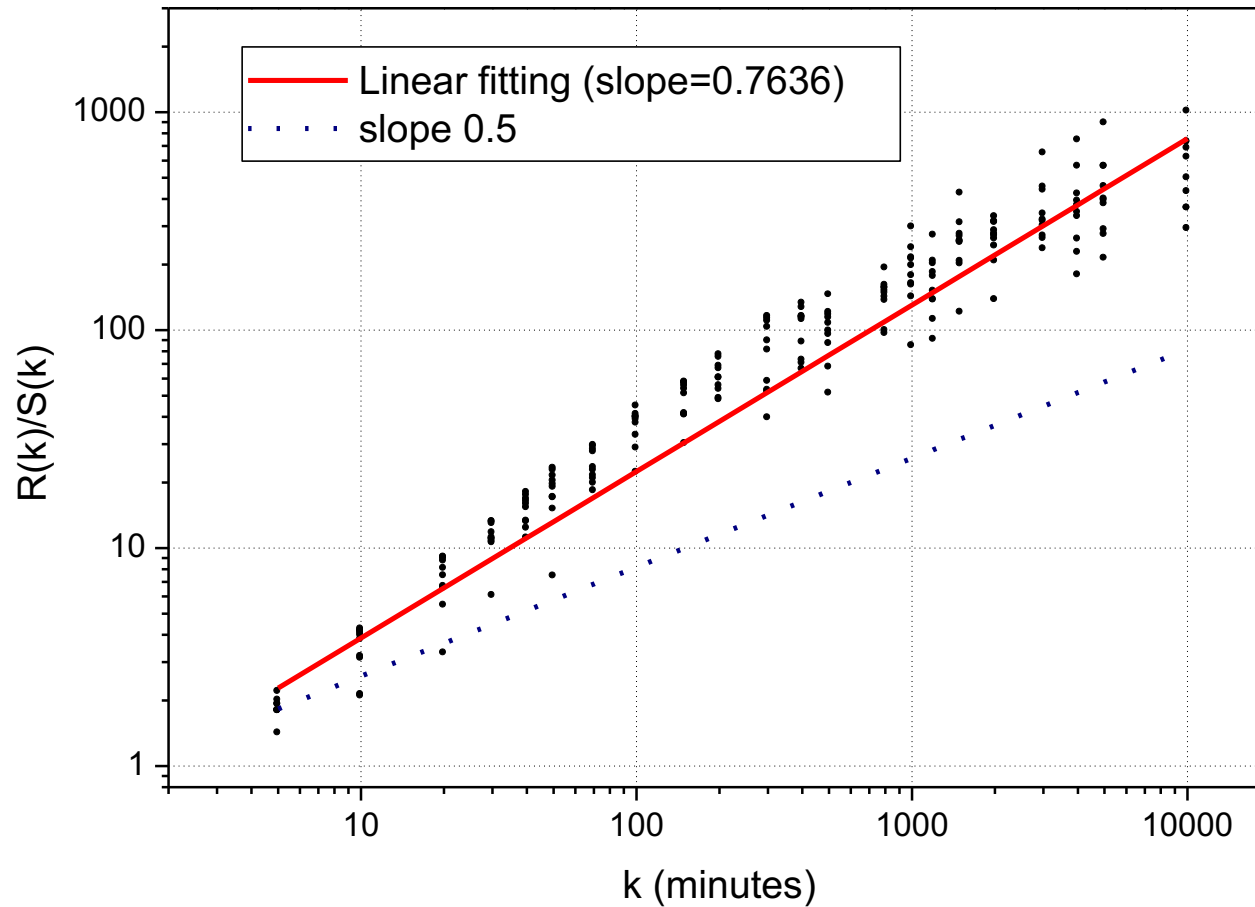
# Correlations



**Correlation in short term is high → predictable arrival rate**

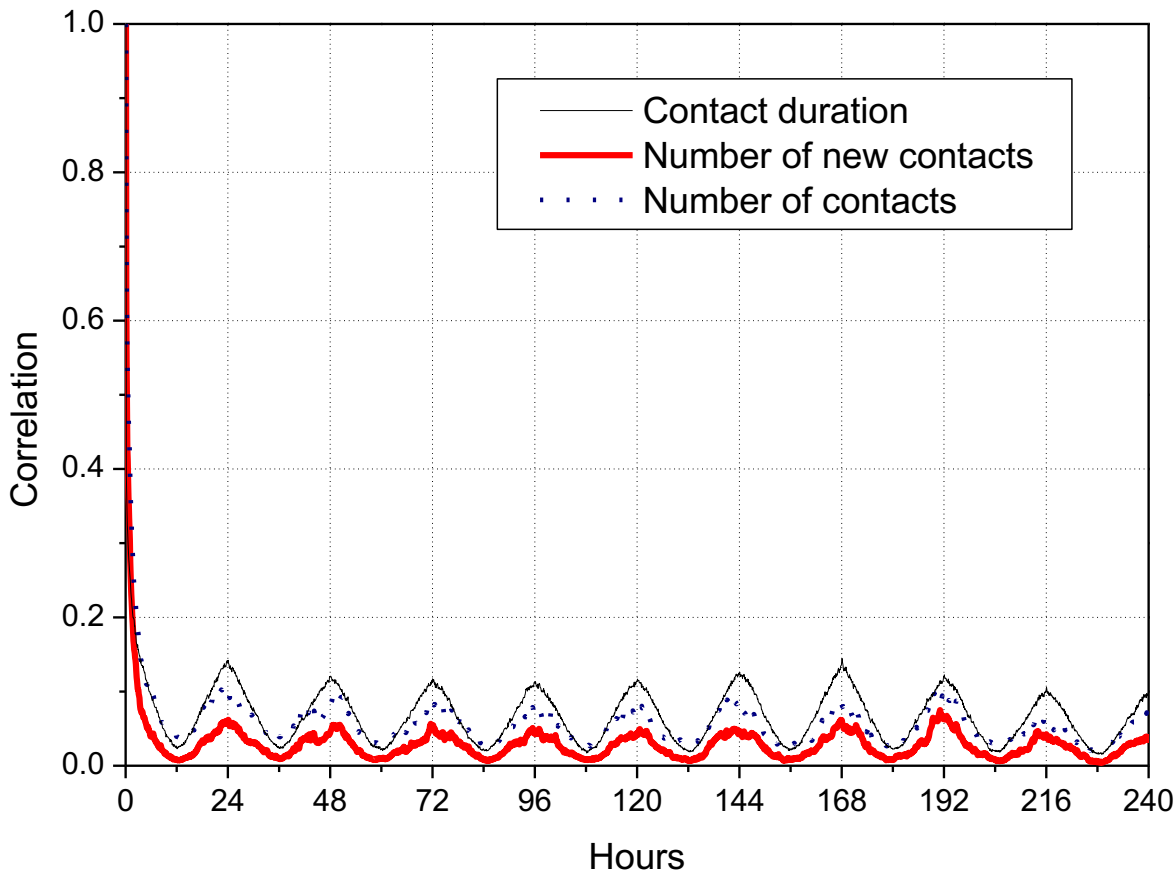


# Self similar contact patterns



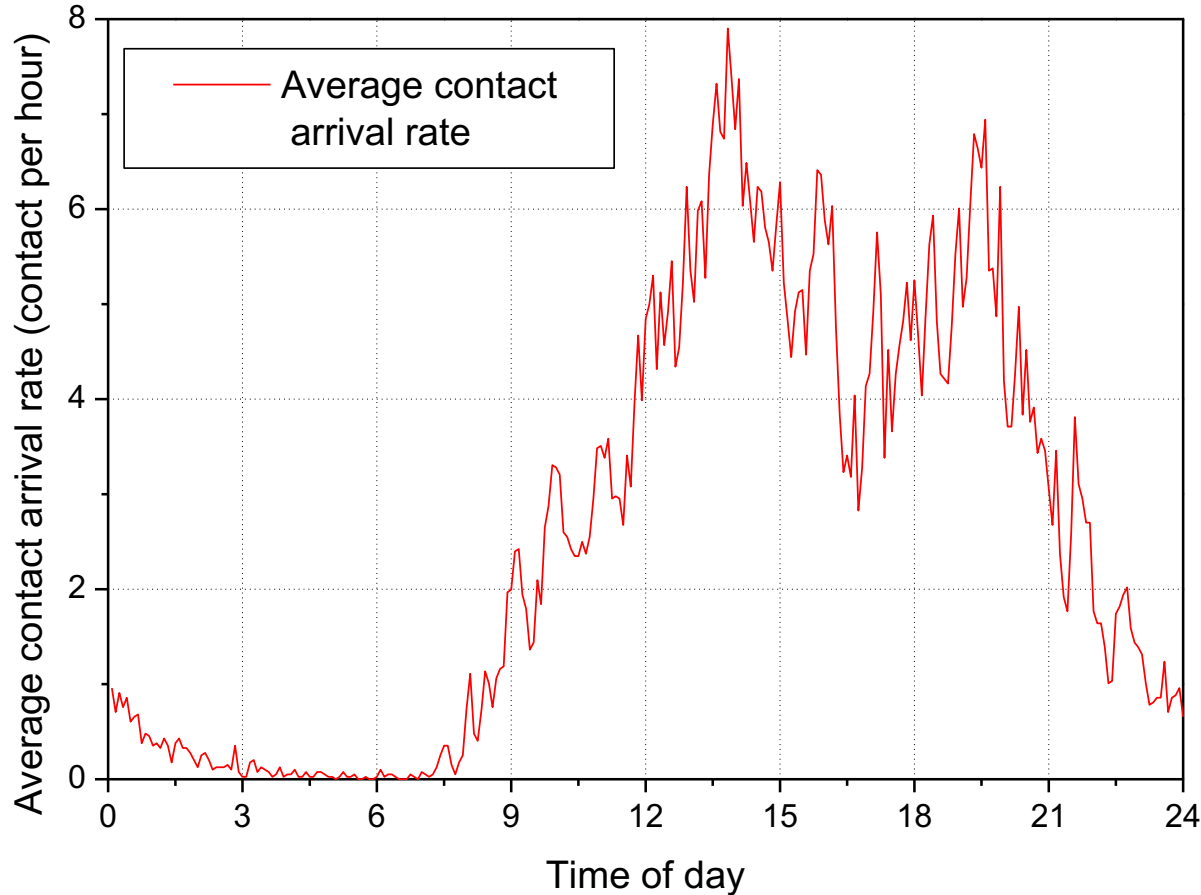
- The R/S test shows the process is self similar
- Hurst parameter = 0.76

# Correlations



- A 24 hours correlation period can be seen

# Varying contact arrival rate

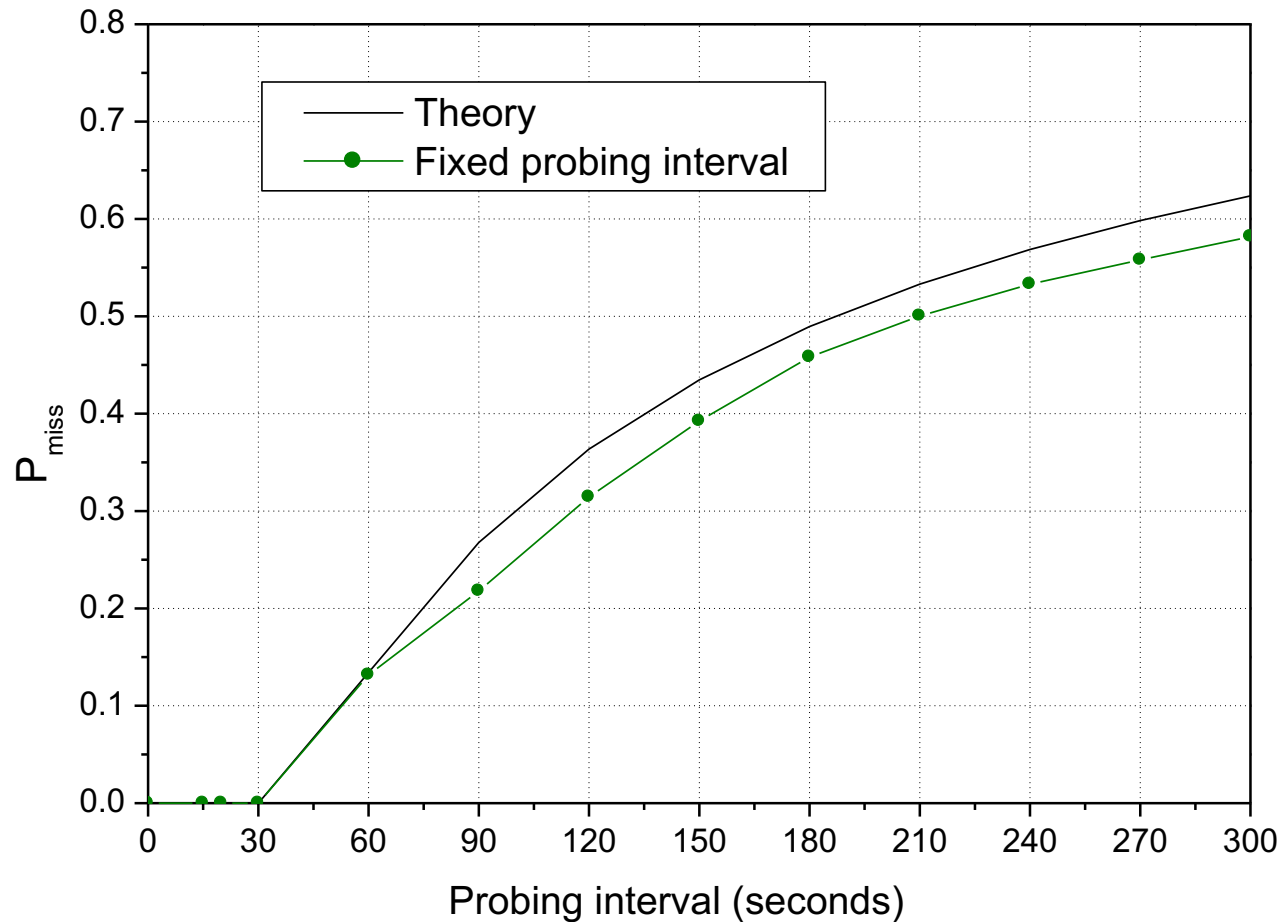


- **Obvious arrival rate change according to time of day**

# What we learned from the data

- The arrival rate changes at different time
- The process is self similar and has high correlation in short time periods. This shows we can predict the arrival rate to some extent.
- Adaptive scheme I may not be useful due to Pareto distributed contact duration
- Adaptive scheme II is promising

# Simulations on real contact logs

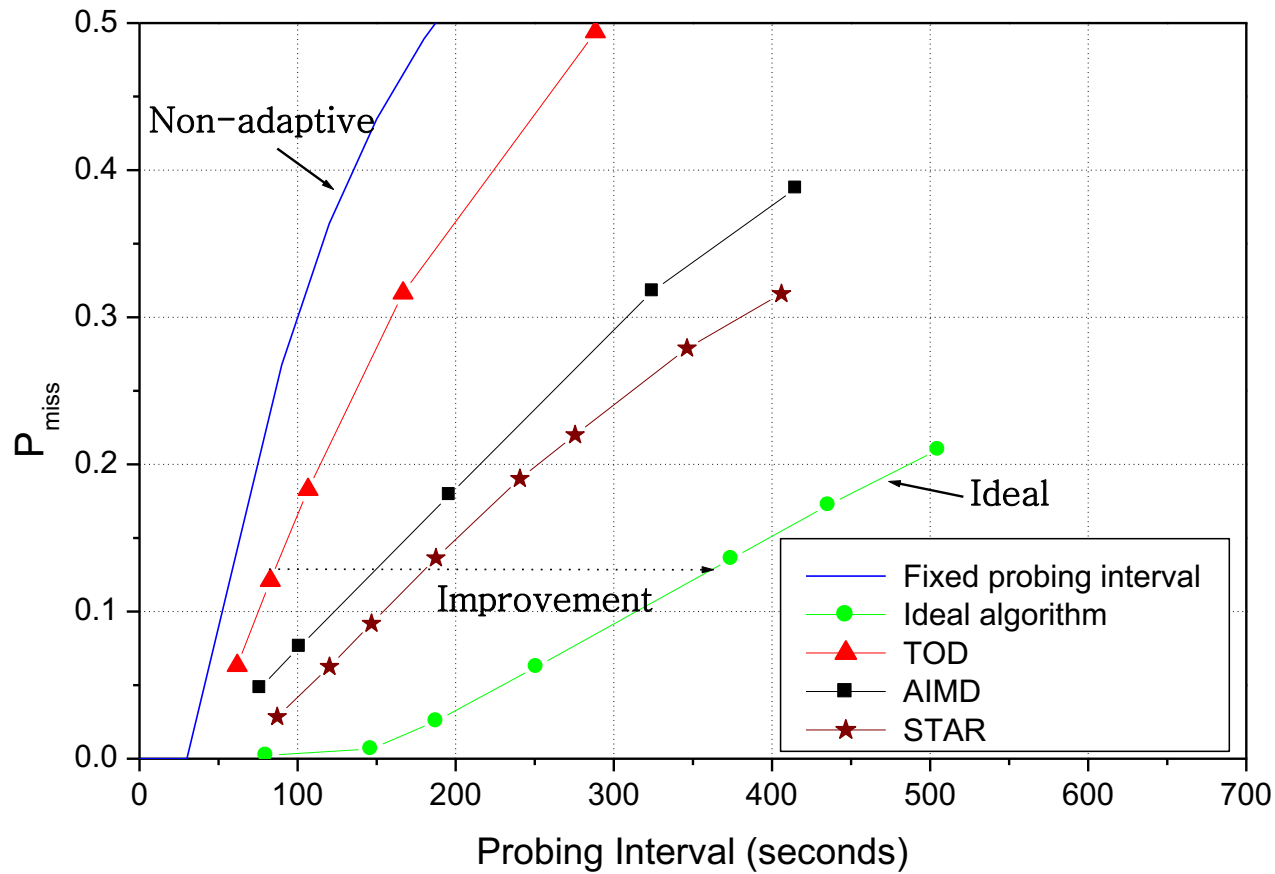


- **Constant probing rate, verify the theory**

# Adaptive schemes

- **Constant probing interval**
- **Use time of day information**
- **AIMD**
- **STAR (Short Term Arrival Rate estimation)**
- **Ideal scheme (perfectly predicts the arrival rate of next hour)**

# Performance



# Conclusion

- The contact arrival pattern can be modeled as a random process
- Bluetooth based experiments shows the human behavior patterns
- Based on different applications, we can use different adaptive schemes
- Synthetic Contact Models can also be derived from the real data patterns

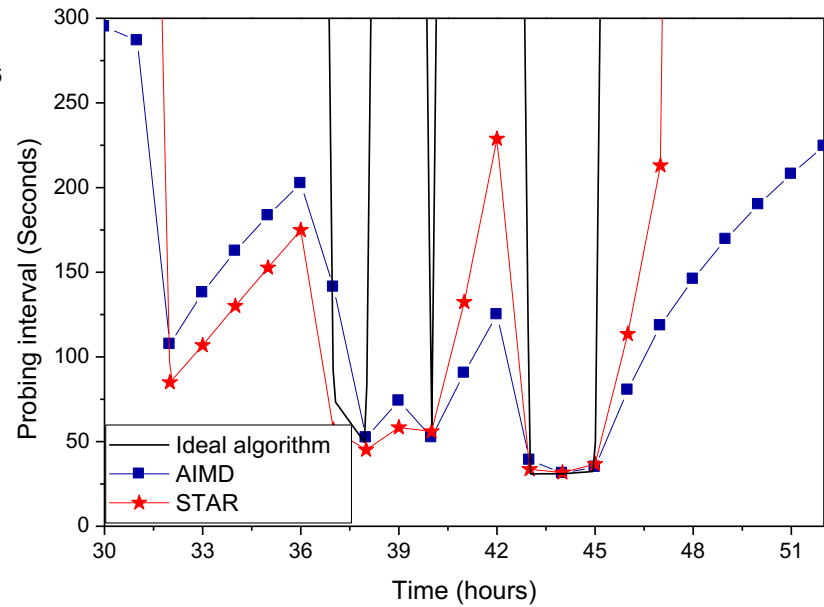
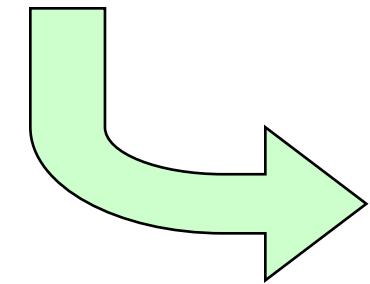
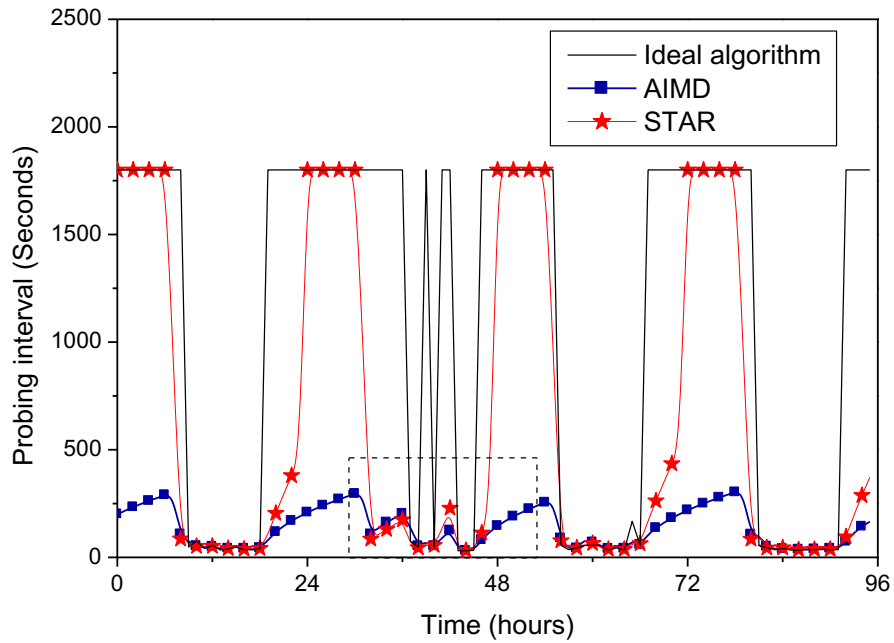


Thank you!



- Measure the short term average arrival rate
- Gradually increase the contact probing interval, and sharply reduce it when finds a new contact
- Use day of time information to improve the performance
- Not sensitive to the  $k$  value
- Performs 20% better than AIMD

# STAR trace log



# STAR with different $k$

