

Sharing and Virtualization in Future Wireless Networks

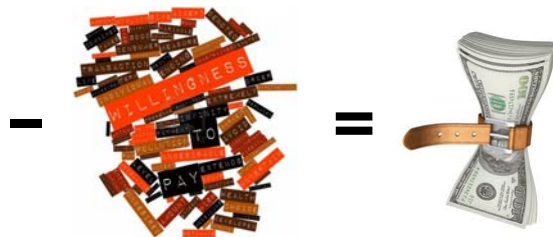
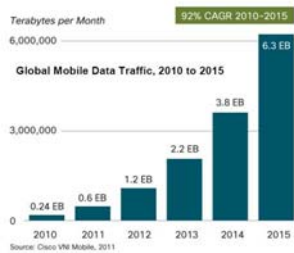
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Professor



CROWNCOM, Oulu, Finland, 4 June 2014



Sharing, Sharing, Sharing

- Infrastructure sharing among operators
- Spectrum sharing
- Sharing of crowdsourced infrastructure



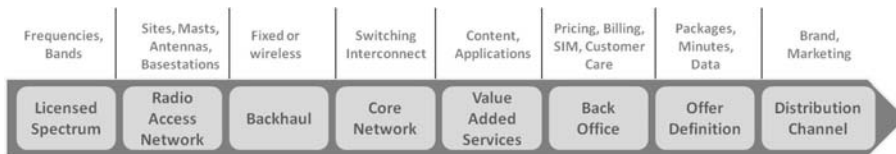
the STORY of...

- ✓ The ability to instantiate wireless networks dynamically, in response to dynamic changes in demand and customized to specific service requirements

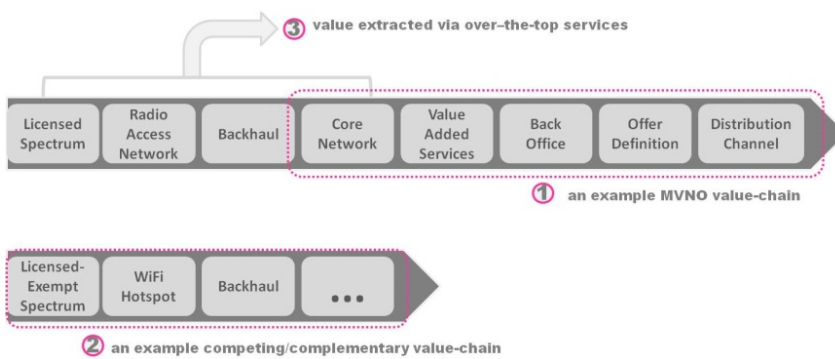
OR

- ✓ Networks without borders

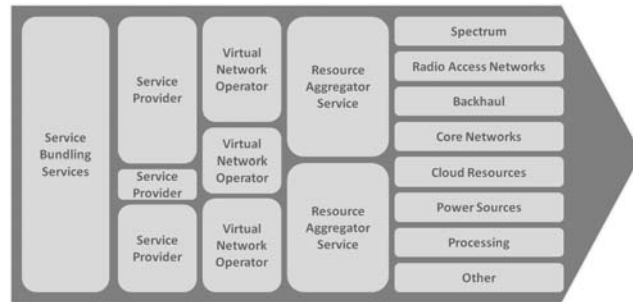
Mobile Network Operator (MNO) value chain



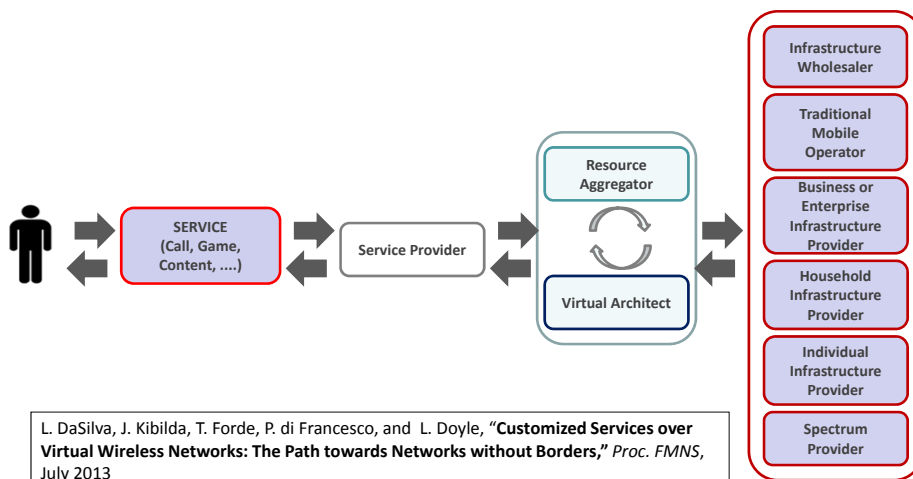
Some issues with the MNO value chain



A future based on sharing and virtualization



Customized virtual networks



L. DaSilva, J. Kibilda, T. Forde, P. di Francesco, and L. Doyle, "Customized Services over Virtual Wireless Networks: The Path towards Networks without Borders," *Proc. FMNS*, July 2013

L. Doyle, J. Kibilda, T. Forde, and L. DaSilva, "Spectrum without Bounds, Networks without Borders," *Proceedings of the IEEE*, March 2014.

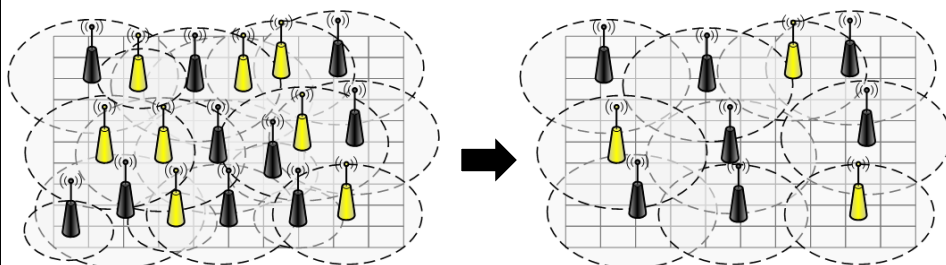
Resource Pool

Increased efficiency and lower costs through...

- ① Incentives for the deployment of localized (small cell, primarily) infrastructure by medium-sized and small operators
- ② The ability to provide service over infra-structure that employs heterogeneous technologies, and has different properties and ownership
- ③ Improved service in currently under-served areas
- ④ The ability to offer virtual wireless networks with different associated quality of experience, at different price points

Sharing and macrocells: coverage and capacity

Network shaping (or NlaaS): Architect a network that meets the service requirements at a minimum resource cost

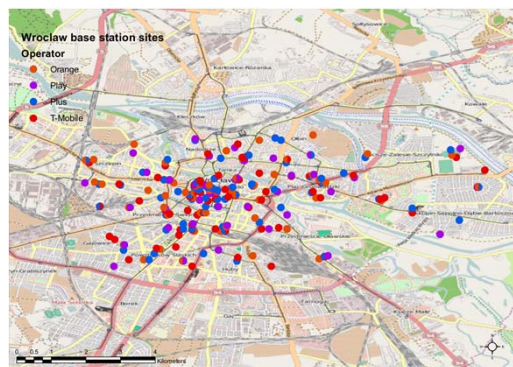


Coverage optimization

$$\begin{aligned}
 & \min_{\{x_j, z_i\}} \sum_{j \in S} c_j x_j \\
 \text{s.t.} & \sum_{j \in S} a_{ij} x_j \geq z_i, \forall i \in P \\
 & \sum_{i \in P} (1 - z_i) \log(\Pr(\xi_i = 0)) \geq \log(p) \\
 & x_j \in \{0, 1\}, \forall j \in S \\
 & z_i \in \{0, 1\}, \forall i \in P
 \end{aligned}$$

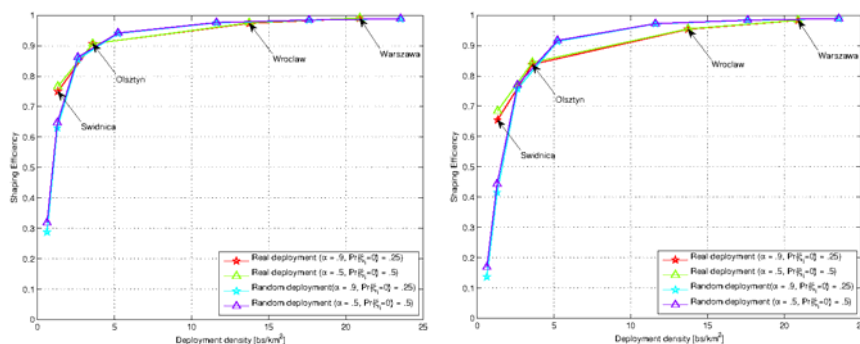
Where $a_{ij} = \mathbb{I}(\frac{r_{ij}}{r_i^*} \geq 1)$, p denotes pre-specified reliability level and ξ_i denotes service request coming from pixel i

Case study: Poland



Area	BS	GSM900 BS	GSM1800 BS	UMTS BS	Intra-operator Co-located [%]	Inter-operator co-located [%]
Warszawa	514	423	174	337	54.9	4.5
Wrocław	273	207	122	229	66.3	8.1
Olsztyn	74	56	37	68	79.7	5.4
Świdnica	29	27	13	20	65.5	6.9

Coverage sharing – efficiency results

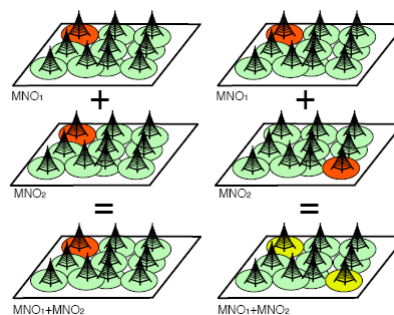


Efficiency gain through infrastructure sharing for uniform deployment and Polish case study; a) homogeneous power allocation, b) heterogeneous power allocation

J. Kibilda and L. DaSilva, "Efficient Coverage through Inter-operator Infrastructure Sharing in Mobile Networks," in *Proc. of Wireless Days*, November 2013.

Traffic dynamics

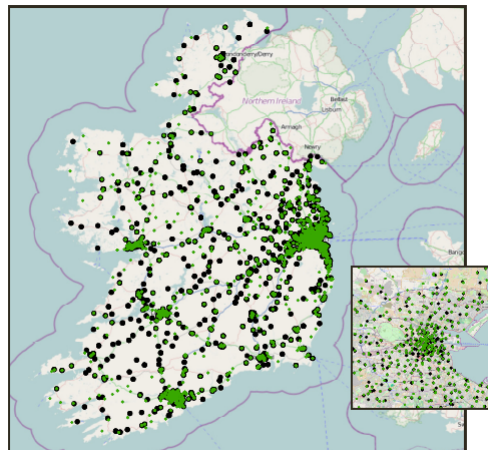
- Dataset from two Irish operators
 - Data sessions (2G/3G)
 - Voice call records (2G/3G)
 - 10,000 2G (GSM/GPRS) and 12,000 3G (W-CDMA/HSPA) transmitters



- Better understanding of traffic dynamics in cellular networks
 - Temporal characteristics
 - Spatial characteristics
 - Spatio-Temporal characteristics
 - Correlation in demand
- The latter is the critical factor in determining the desirability of sharing

The data set

- Call detail records
- For each transmitter: position, azimuth, sectorization, coverage area
- For voice call and data session: transmitter where it started/ended, duration, amount of data

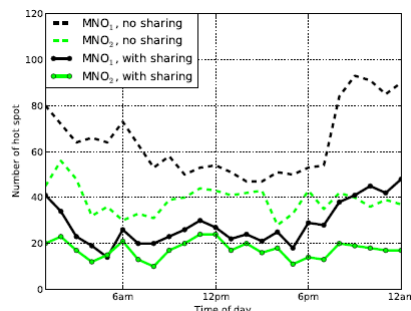


- Black: MNO₁
- Green: MNO₂
- (Inset shows Dublin)

Technology	MNO ₁	MNO ₂	Total
3G (W-CDMA/HSPA)	5656	6679	12335
2G (GSM/GPRS)	5423	4040	9463

Geographical correlation in demand

- Assessed the presence of ‘hot spots’ – high load sectors surrounded by low load ones
- Also assessed the temporal and geographical correlation on demand



3G data, all Ireland, weekdays

		Operator	Ireland	Urban	Rural
Deployment density [sectors/km ²]		MNO ₁	0.080	4.488	0.040
		MNO ₂	0.095	5.615	0.042
Space correlation [Moran's Index]	we	MNO ₁	0.10	0.08	0.11
		MNO ₂	0.13	0.11	0.25
	wd	MNO ₁	0.07	0.08	0.10
		MNO ₂	0.04	0.04	0.11
hot spot reduction	we	MNO ₁	-55%	-38%	-93%
		MNO ₂	-55%	-35%	-50%
	wd	MNO ₁	-64%	-46%	-96%
		MNO ₂	-54%	-44%	-93%

P. Di Francesco, F. Malandrino, L. DaSilva, "Network Sharing in Cellular Networks: a Trace-Driven Analysis," *ACM SIGCOMM Workshops*, 2014



Current areas of investigation...

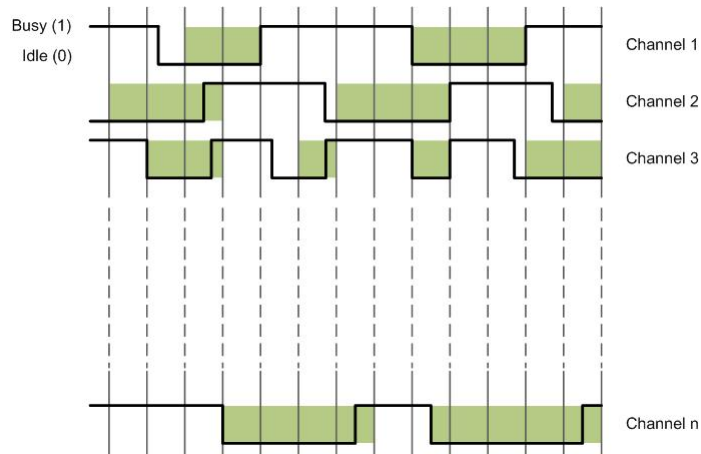
- Quantifying the expected efficiency gain from increased resource sharing and its relationship to correlation in demand experienced by infrastructure providers
- Stochastic geometry models of infrastructure deployment and study of the impact of different infrastructure density and distribution on the potential efficiency gains from sharing
- Game theoretic models of incentives and preferences from the different players in this architecture, capturing the geographic nature of wireless access resources

the STORY of...

- ✓ The selection of bundles of channels for opportunistic use, à la the three-tier system proposed by the PCAST report

OR

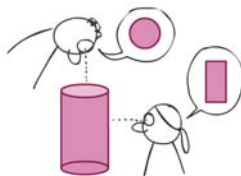
- ✓ What does Lempel-Ziv complexity have to do with learning about primary activity in shared spectrum?



- ✓ Suppose a primary wants to divide its spectrum into bundles of channels for which it grants opportunistic usage rights
- ✓ How to pick equivalent (*fungible*) bundles?

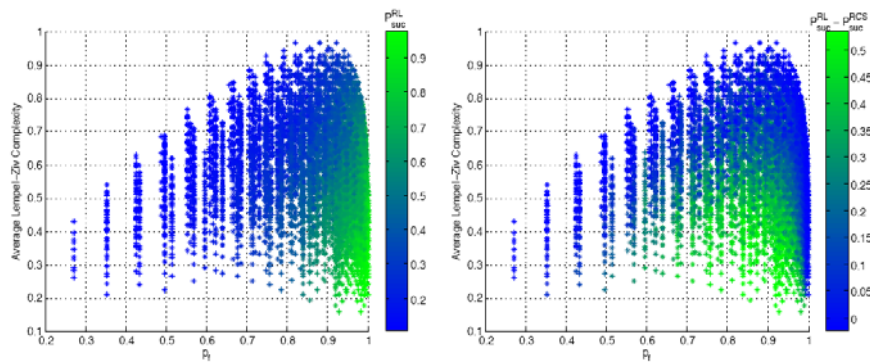


- ✓ The obvious answer: use *duty cycle* to characterize the desirability of a channel



- ✓ The ability to take advantage of dynamic variations in channel usage is highly dependent on the amount of structure in this usage
→ *Lempel Ziv complexity*

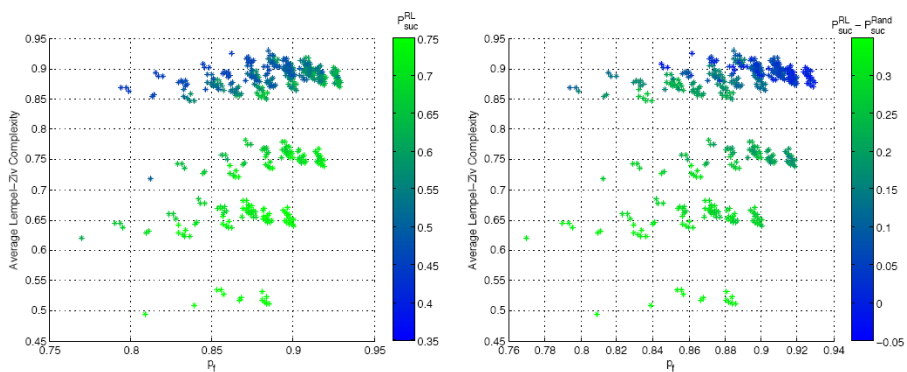
Reinforcement learning and LZ complexity



- ✓ Performance of Q-learning, as a function of LZ-complexity and the probability of at least one free channel existing
- ✓ $S = 3$ channels, 2-state MC model of channel activity

I. Macaluso, D. Finn, B. Ozgul, L. DaSilva, "Complexity of Spectrum Activity and Benefits of Learning for Dynamic Channel Selection," *IEEE JSAC*, 2013

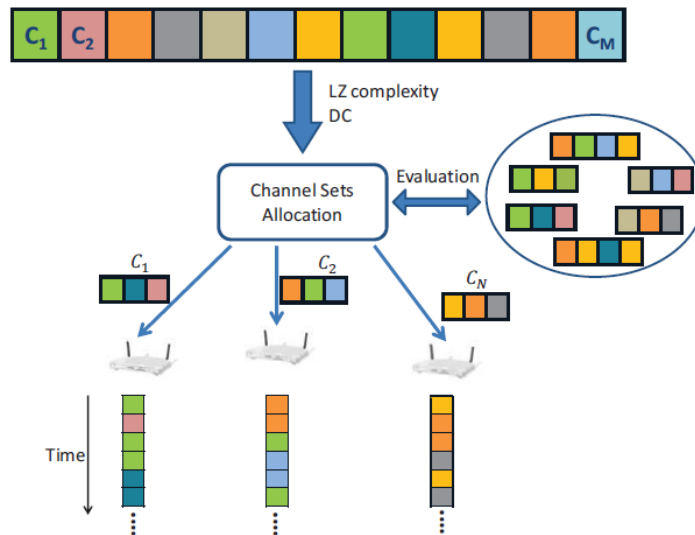
Reinforcement learning and LZ complexity



- ✓ Performance of Q-learning, as a function of LZ-complexity and the probability of at least one free channel existing
- ✓ $S = 3$ channels, real measurements in ISM band, outdoors

I. Macaluso, D. Finn, B. Ozgul, L. DaSilva, "Complexity of Spectrum Activity and Benefits of Learning for Dynamic Channel Selection," *IEEE JSAC*, 2013

Selecting sets of channels for LSA



Problem formulation

- ✓ We formulate the selection of the channel sets as:

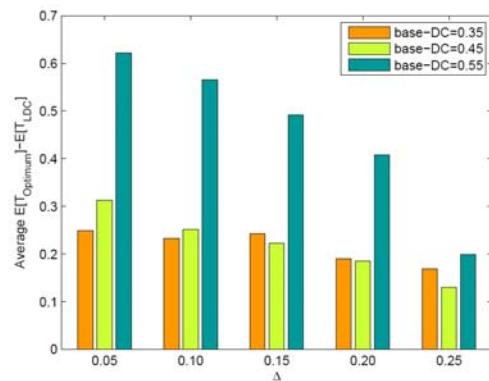
$$\max_{C_i} \min\{u(C_i)\}$$

s.t.

$$C_i \cap C_j = \emptyset \quad \forall i, j \in N, i \neq j$$

$$C_i \in \mathcal{P}_\alpha(S) \quad \forall i \in N$$

- ✓ $S = \{1, \dots, S\}$ is the set of channels and the set of wireless systems is denoted by $N = \{1, \dots, N\}$
- ✓ $\mathcal{P}_\alpha(S)$ is the set of subsets C of S with cardinality $|C| = \alpha$



- ✓ 3 wireless networks, 20 channels (10 with high LZ and base DC as indicated, and 10 with low LZ and DC = base-DC + Δ)
- ✓ Improvement over simply selecting channels with lowest DC

I. Macaluso, H. Ahmadi, L. DaSilva, "Fungible Orthogonal Channel Sets for Multi-user Exploitation of Spectrum," *submitted*, 2014



Current areas of investigation...

- Distributed resource management mechanisms under imperfect information (game theoretic models)
- Fungibility in virtual networks built on multi-provider infrastructure and heterogeneous access technologies
- Spectrum sharing solutions for small cell deployments coexisting with radar bands



- ✓ **Sharing:** why stop with spectrum?
 - ✓ Base stations, backhaul, storage, processing, back office, ...
 - ✓ Crowdsourcing

- ✓ **Virtualization:** why stop with SDNs?
 - ✓ Virtualizing the wireless access

