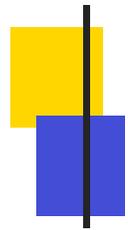


Future Safe Havens

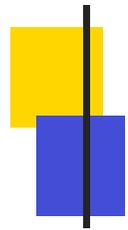
Jon Crowcroft,

<http://www.cl.cam.ac.uk/~jac22>



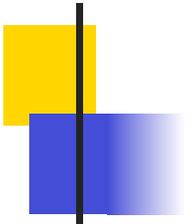
Private Data Center->Public Cloud

- ATI partners e.g.
 - Farr/NHS Scotland
 - HSBC
- Motives for public cloud
 - Scale out/cost save
 - Higher Throughput analytics
 - Share "access" with more researchers
 - <Yours goes here>



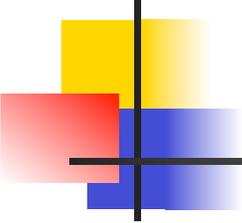
Infrastructure Location

- Keep friends&enemies near:
 - Legal/Regulatory Stuff (incl GDPR)
 - Latency/Availability etc
 - Control (physical access etc)
- Need to virtualise these (better)
 - Crypt Data at rest
 - Crypt data during "processing"
 - key management etc
 - *Enclave... SGX, Trust Zone, AMD, CHERI*



GDPR - 2018 - right to an explanation

- ✘ **MISTAKES HAPPEN**
 - ✘ **ERROR ON INPUT**
 - ✘ E.G. AMOUNT OF \$, AGE, ETC
 - ✘ **MISTAKE IN CODE**
 - ✘ E.G. IF (C=3) {} ...
 - ✘ **MISTAKE IN TRAINING**
 - ✘ E.G. SELECTION BIAS - PROB OF RE-OFFENDING ONLY TRAINED ON OFFENDERS
 - ✘ **MISTAKE IN ML/INFERENCE**
 - ✘ E.G. ACQUIRE A LATENT VARIABLE/RULE == GENDER (OR AGE)
 - ✘ **SOMETHING WE HAVNT THOUGH OF YET**
 - ✘ EMERGENCE?
- ✘ **RIGHT TO REDRESS, AND BALANCE ASYMMETRIC POWER**

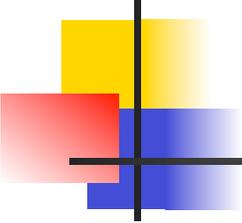


SGX opportunity

- Not the only piece, of course
 - Static/dynamic analysis etc
 - Unikernels & s/w verification
- Can use SGX on
 - Container (SCONE)
 - Platform basis, Hadoop, Flink, Spark

<https://www.microsoft.com/en-us/research/publication/vc3-trustworthy-data-analytics-in-the-cloud>

- Or application basis



MARU...@ turing.ac.uk

- ATI w/ Intel, Dstl, Docker, Microsoft

- Hiring:-

<https://www.turing.ac.uk/jobs/research-associate-maru-project/>

- Compare what is in SGX

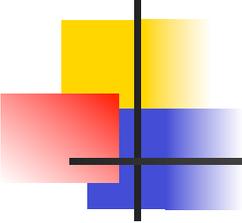
- Enter/leave cost, crypt memory o/h etc
- Hypervisor?

- Compare w/ container on trustzone, cheri, AMD etc

- Common APIs for keys etc
- Virtualize?

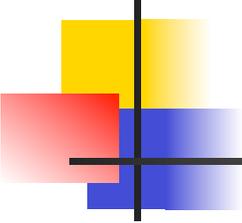
- Pen test

- many side channel pb
- What if weak homomorphic crypto & diff priv?



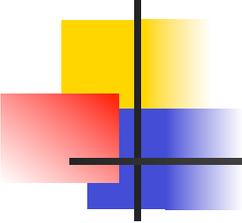
Public Cloud->Databox (or HAT)

- Databox (and hat) take opposite view
- Re-decentralize
- Keep analytics/ML as a service
 - Mix of distributed, priv pres ML+
 - Hierachy of 3rd party aggregators, MPC
 - <http://www.databoxproject.uk/>
- HAT reverses direction of value...
 - Audit (distributed ledger)
 - Get paid (money (real or vurt))
 - <https://www.hatdex.org/>



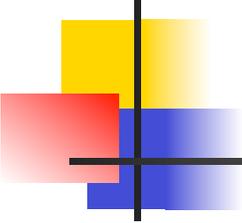
Container - migration&replica

- Replicate (to cloud enclave)
 - for recovery (from fail,theft,loss)
- Migrate (to other personal cloud)
 - for low latency
- Most new data is append only - so use distributed ledger
 - (tamper proof logs - see datakit in docker)
- Consistency of replicas -
 - e.g. use fpaxos



Distributed Analytics

- Motives e.g.
 - Move code to data
 - Keep data close to owner/primary user
 - Guarantee can audit trail access
 - Add yours here
- Challenges
 - Depends on ML technology of choice & goal
 - PCA/Clustering, random forests
 - Curve fitting (regression etc)
 - Model Inferencing - e.g. Bayesian inference
 - Distributed differential privacy tricky
 - Hierarchical versus P2P?



Distributed Analytics

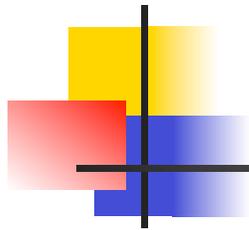
- Hierarchy easiest
 - Aggregation points/servers broker "model learned so far"
 - Have to be trusted by subset of leaves
 - Leaf can choose to change aggregator
- P2P just extension of this to dynamic, faster choice
- Distributed/Parallel ML
 - From data centers
 - Clustering on tuples easy If independent

Future Proof for GDPR

Privacy by Design and by Default - HAT address all GDPR privacy requirement from its design principle to its security solution.

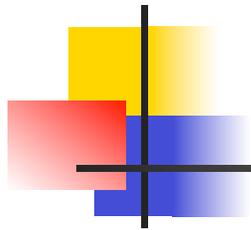
- HAT ecosystem data exchange is based on fully specified privacy terms - time specific, recipient specific, minimum data points **specific with full intention disclosed**. Violation against any of such terms may result a ban from the Ecosystem.
- Consent by design and by default -
 - the PCST PoC mandates a "specific, informed and freely given and unambiguous" intension disclosure of data usage, for every single personal data access instances.
 - HAT technology ensures that an exchange is only authorised and kept valid by individual's case specific consent
- Rights for Individuals by design and by default - encapsulated personal data containers isolated for each individual, allows an individual is in full control of its HAT, hence inherently owns all of the following:
 - Right to Access | Right to be informed | Right to rectification | Right to restrict processing | Right to object to market
 - Right of data portability | Right to be forgotten | Right to object to automated decision making and profiling
- Accountability and governance - PCST CoP mandates every ecosystem member to higher level of accountability and governance practice.
 - Record keeping - HAT ecosystem automatically tracks data exchange, even at a much more granular level than GDPR requires - it documents the exchange parties, time of access, detailed data points, intension and T&C, for every single transaction

<http://hatdex.org/> <http://hatecommunity.org/>



Things we're not covering today

- Database (Farr/ATI work now)
 - Query planning w/ privacy
 - K-anonymity
 - Weak homomorphic crypto etc
- Threat modeling
 - Assuming implicit 😊
 - Suffice it to say hypervisor vulnerabilities exist
 - So need trusted stuff on untrusted platform...
 - ...on new trusted stuff...



Who Am I?

