# An introduction to error-correcting codes 

 and some current day applicationsdr. Relinde Jurrius

University of Neuchâtel, Switzerland
December 20, 2016

## S W I T E E L R A N D

## $S \quad W \quad I \quad T \quad E \quad E \quad L \quad R \quad A \quad N \quad D$

Redundancy


回家品品



$0 \longrightarrow 00000$
$1 \longrightarrow 11111$

$$
\begin{array}{lll}
0 & \longrightarrow & 00000 \\
1 & \longrightarrow & 11111 \\
& & 00000 ? \\
& 10111 ? 0
\end{array}
$$

$$
\begin{array}{lll}
0 & \longrightarrow 00000 & 00000 ? \\
1 \longrightarrow 11111 & 01100 ? \\
& & 10111 ?
\end{array}
$$

$$
\begin{array}{lllll}
0 & \longrightarrow & 00000 & 00000 ? & \longrightarrow \\
1 & \longrightarrow & 11111 & 01100 ? & \longrightarrow \\
& & & 0 \\
& & 10111 ? & &
\end{array}
$$



$$
\begin{array}{lllll}
0 & \longrightarrow & 00000 & & 0000 ? \\
1 & \longrightarrow & \longrightarrow & 0 \\
& 01100 ? & \longrightarrow & 0 \\
& 10111 ? & \longrightarrow & 1
\end{array}
$$

Redundancy: $\frac{4}{5}$


# Richard Hamming (1915-1998) 

Bell Labs, ca. 1950


$$
\begin{array}{lllllll}
a & b & c & d & e & f & g \\
1 & 0 & 1 & 1 & & &
\end{array}
$$



$$
\begin{array}{lllllll}
a & b & c & d & e & f & g \\
1 & 0 & 1 & 1 & & &
\end{array}
$$





$$
\begin{array}{lllllll}
a & b & c & d & e & f & g \\
1 & 0 & 1 & 1 & & &
\end{array}
$$

$1011 \longrightarrow 1011010$

Redundancy: $\frac{3}{7}$


## $\begin{array}{lllllll}a & b & c & d & e & f & g\end{array}$ <br> $1 \begin{array}{lllllll}1 & 0 & 0 & 1 & 0 & 0 & 1\end{array}$



$$
\begin{array}{lllllll}
a & b & c & d & e & f & g \\
1 & 0 & 0 & 1 & 0 & 0 & 1
\end{array}
$$





$$
\begin{array}{lllllll}
a & b & c & d & e & f & g \\
1 & 0 & 0 & 1 & 0 & 0 & 1
\end{array}
$$



## $1001001 \longrightarrow 1001101$ <br> $1001101 \longrightarrow 1001$

Low redundancy

Large differences between codewords

Fast encoding / decoding

Distance function $d(x, y)$ is a metric if:

$$
\begin{aligned}
& d(x, y) \geq 0 \text { with equality iff } x=y \\
& d(x, y)=d(y, x) \\
& d(x, y)+d(y, z) \geq d(x, z)
\end{aligned}
$$



Alphabet $\mathcal{Q}$
Length $n$
Hamming metric on $\mathcal{Q}^{n}$ :

$$
\begin{aligned}
d(x, y) & =\text { number of positions in which vectors differ } \\
& =\left|\left\{i \in[n]: x_{i} \neq y_{i}\right\}\right| \\
& \text { error-correcting code: } C \subseteq \mathcal{Q}^{n}
\end{aligned}
$$

$$
8
$$



## d minimum distance

e error-correcting capacity

$$
=\left\lfloor\frac{d-1}{2}\right\rfloor
$$

Linear code: $C \subseteq \mathbb{F}_{q}^{n}$ subspace of dimension $k$

Generator matrix: rows generate $C$
Encoding: $\mathbf{m} G=\mathbf{c}$

Parity check matrix: $C$ is kernel of this matrix

$$
\mathrm{Hc}^{T}=\mathbf{0}
$$



$$
\begin{aligned}
& G=\left(\begin{array}{lllllll}
1 & 0 & 0 & 0 & 1 & 1 & 0 \\
0 & 1 & 0 & 0 & 1 & 0 & 1 \\
0 & 0 & 1 & 0 & 1 & 1 & 1 \\
0 & 0 & 0 & 1 & 0 & 1 & 1
\end{array}\right) \\
& H=\left(\begin{array}{lllllll}
1 & 1 & 1 & 0 & 1 & 0 & 0 \\
1 & 0 & 1 & 1 & 0 & 1 & 0 \\
0 & 1 & 1 & 1 & 0 & 0 & 1
\end{array}\right)
\end{aligned}
$$

Typical problem:
Fix $n$ and $k$ (redundancy), make $d$ as large as possible

Typical problem:
Fix $n$ and $k$ (redundancy), make $d$ as large as possible

Singleton bound: $d \leq n-k+1$

Equality: Maximum Distance Separable (MDS) code

Reed-Solomon code: pick $\alpha_{1}, \ldots, \alpha_{n} \in \mathbb{F}_{q}$

$$
\begin{gathered}
C=\left\{\left(f\left(\alpha_{1}\right), \ldots, f\left(\alpha_{n}\right)\right): f \in \mathbb{F}_{q}[x], \operatorname{deg} f<k\right\} \\
\\
G=\left(\begin{array}{ccccc}
1 & 1 & \cdots & 1 & 1 \\
\alpha_{1} & \alpha_{2} & \cdots & \alpha_{n-1} & \alpha_{n} \\
\vdots & \vdots & & \vdots & \vdots \\
\alpha_{1}^{k-1} & \alpha_{2}^{k-1} & \cdots & \alpha_{n-1}^{k-1} & \alpha_{n}^{k-1}
\end{array}\right)
\end{gathered}
$$

# Reed-Solomon code is MDS 

Several fast decoding algorithms known

Needs large alphabet: $q>k$

# Current day applications of error-correcting codes: 

- Network coding

Distributed storage

Code-based crypto



Idea: send (rows of) matrices instead of vectors

Send: $X_{1}, \ldots, X_{m} \in \mathbb{F}_{q}^{n}$
Receive: $Y_{1}, \ldots, Y_{m} \in \mathbb{F}_{q}^{n}$

No errors: $Y=A X$
$A$ full rank, known from the network structure

Send: $X_{1}, \ldots, X_{m} \in \mathbb{F}_{q}^{n}$
Receive: $Y_{1}, \ldots, Y_{m} \in \mathbb{F}_{q}^{n}$

No errors: $Y=A X$
$A$ full rank, known from the network structure

In practice: $Y=A^{\prime} X+Z$
$A^{\prime}$ rank erasures
$Z$ errors

Send: $X_{1}, \ldots, X_{m} \in \mathbb{F}_{q}^{n}$
Receive: $Y_{1}, \ldots, Y_{m} \in \mathbb{F}_{q}^{n}$

No errors: $Y=A X$
$A$ full rank, known from the network structure

In practice: $Y=A^{\prime} X+Z$
$A^{\prime}$ rank erasures
$Z$ errors

Decoding possible if $\mathrm{rk}\left(A^{\prime}\right)$ not too small and $\mathrm{rk}(Z)$ not too big.
Rank metric: $d(X, Y)=\operatorname{rk}(X-Y)$

## Depends on network structure

Well studied (Hui 1951, Delsarte 1978, Gabidulin 1995)

Good codes known


Ralf Kötter (1963-2009)



Frank Kschischang
(*1962)


Better idea: send (bases of) subspaces instead of matrices

Random linear combinations

Send: basis of $m$-dim subspace $V \subseteq \mathbb{F}_{q}^{n}$
Receive: $m$ vectors in $\mathbb{F}_{q}^{n}$

No errors: received vectors are basis of $V$
(with high probability)

Send: basis of $m$-dim subspace $V \subseteq \mathbb{F}_{q}^{n}$
Receive: $m$ vectors in $\mathbb{F}_{q}^{n}$

No errors: received vectors are basis of $V$ (with high probability)

In practice: $U=\mathcal{H}_{k}(V) \oplus E$ $\mathcal{H}_{k}(V)$ random $k$-dim subspace of $V$
$E$ error-subspace

Send: basis of $m$-dim subspace $V \subseteq \mathbb{F}_{q}^{n}$
Receive: $m$ vectors in $\mathbb{F}_{q}^{n}$

No errors: received vectors are basis of $V$ (with high probability)

In practice: $U=\mathcal{H}_{k}(V) \oplus E$
$\mathcal{H}_{k}(V)$ random $k$-dim subspace of $V$
$E$ error-subspace

Decoding possible if $k$ not too small and $\operatorname{dim}(E)$ not too big.
Subspace distance: $d(U, V)=\operatorname{dim}(U)+\operatorname{dim}(V)-2 \operatorname{dim}(U \cap V)$

Independent of network structure

Faster transmission

Slower decoding

Few codes known

# Current day applications of error-correcting codes: 

Network coding

- Distributed storage

Code-based crypto

## Google

## facebook





# Distributed storage demands different things from codes: 

Erasures instead of errors

Small size: typically $n \leq 15$

Reed-Solomon codes do not preform well

Locality: minimize \# nodes accessed during repair

Locality: minimize \# nodes accessed during repair

Bandwidth: minimize total download bandwidth

Locality: minimize \# nodes accessed during repair

Bandwidth: minimize total download bandwidth

Availability: optimize \# repair possibilities

hot data
vs.

cold data

# Current day applications of error-correcting codes: 

Network coding

Distributed storage

- Code-based crypto

Public key cryptography

# Everyone can encrypt with public function $\mathcal{E}$ <br> Inverse of $\mathcal{E}$ (decryption) is hard to find 

Only feasible with extra information about $\mathcal{E}$

Examples: factoring, DLP


## Peter Shor (*1959)

1994: algorithm for fast factoring using quantum computer
$\rightarrow$ post-quantum cryptography


# Robert J. McEliece (*1942) 



Harald Niederreiter
(*1944)

McEliece crypto system (1978)

Private: Goppa code that can correct $t$ errors
$G$ generator matrix
$S$ base change matrix
$P$ permutation matrix
Public: scrambled generator matrix $G^{\prime}=S \cdot G \cdot P$

McEliece crypto system (1978)

Private: Goppa code that can correct $t$ errors
$G$ generator matrix
$S$ base change matrix
$P$ permutation matrix
Public: scrambled generator matrix $G^{\prime}=S \cdot G \cdot P$

Message m, pick error vector $\mathbf{e}$ of weight at most $t$
Encryption: $\mathbf{m} G^{\prime}+\mathbf{e}$
Decryption: decode received vector using $S, P$ and $G$

Code-based crypto demands different things from codes:

Decoding random linear codes

Hidden structure
(Reed-Solomon codes are difficult to scramble)

# Current day applications of error-correcting codes: 

- Network coding
- Distributed storage
- Code-based crypto

Thank you for your attention.

