

Secrecy, Stealth, Privacy and Storage for Noisy Channels and Identifiers

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Talk at the European School of Information Theory
Chalmers University, Gothenburg, Sweden
April 7, 2016



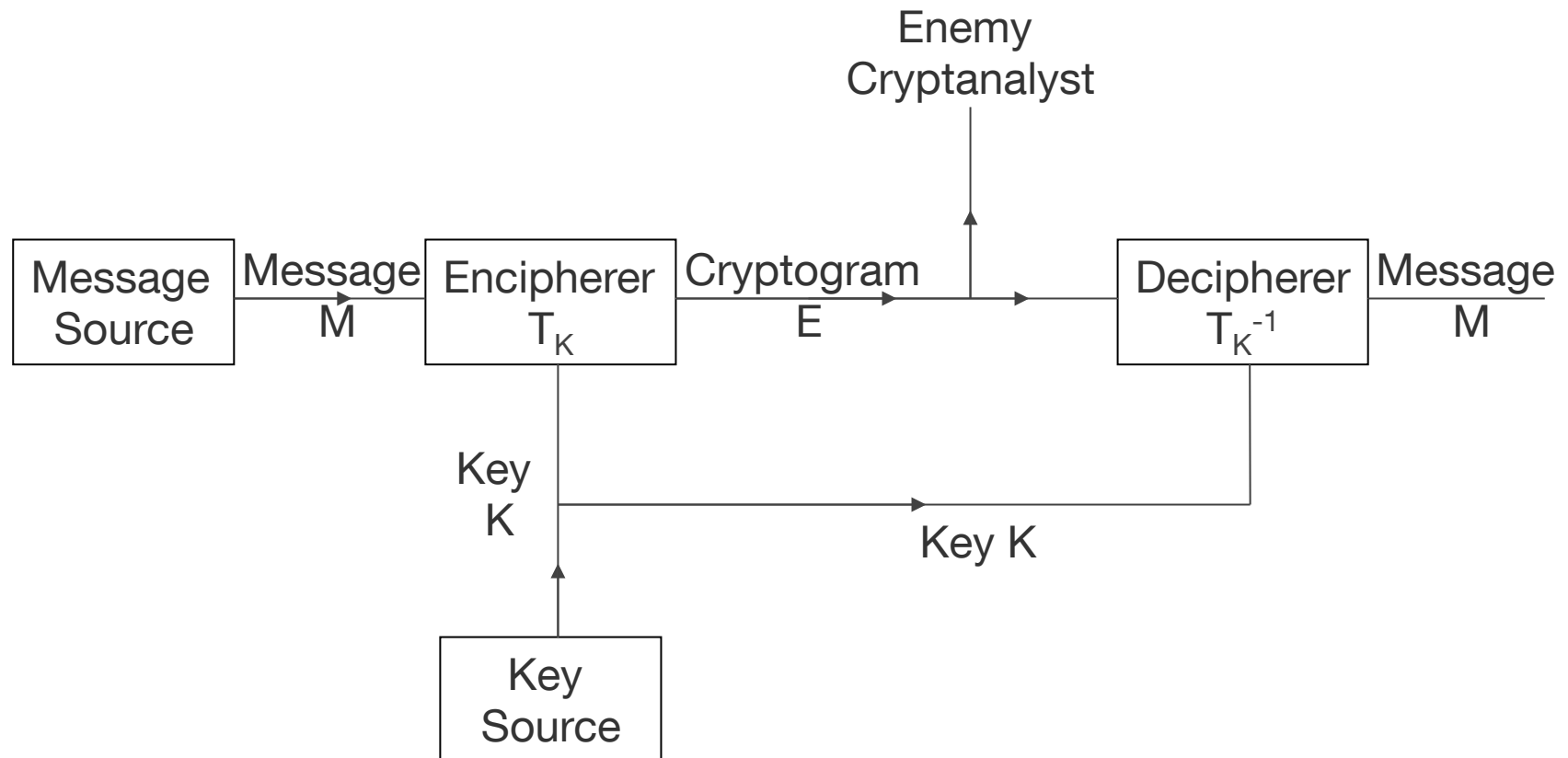
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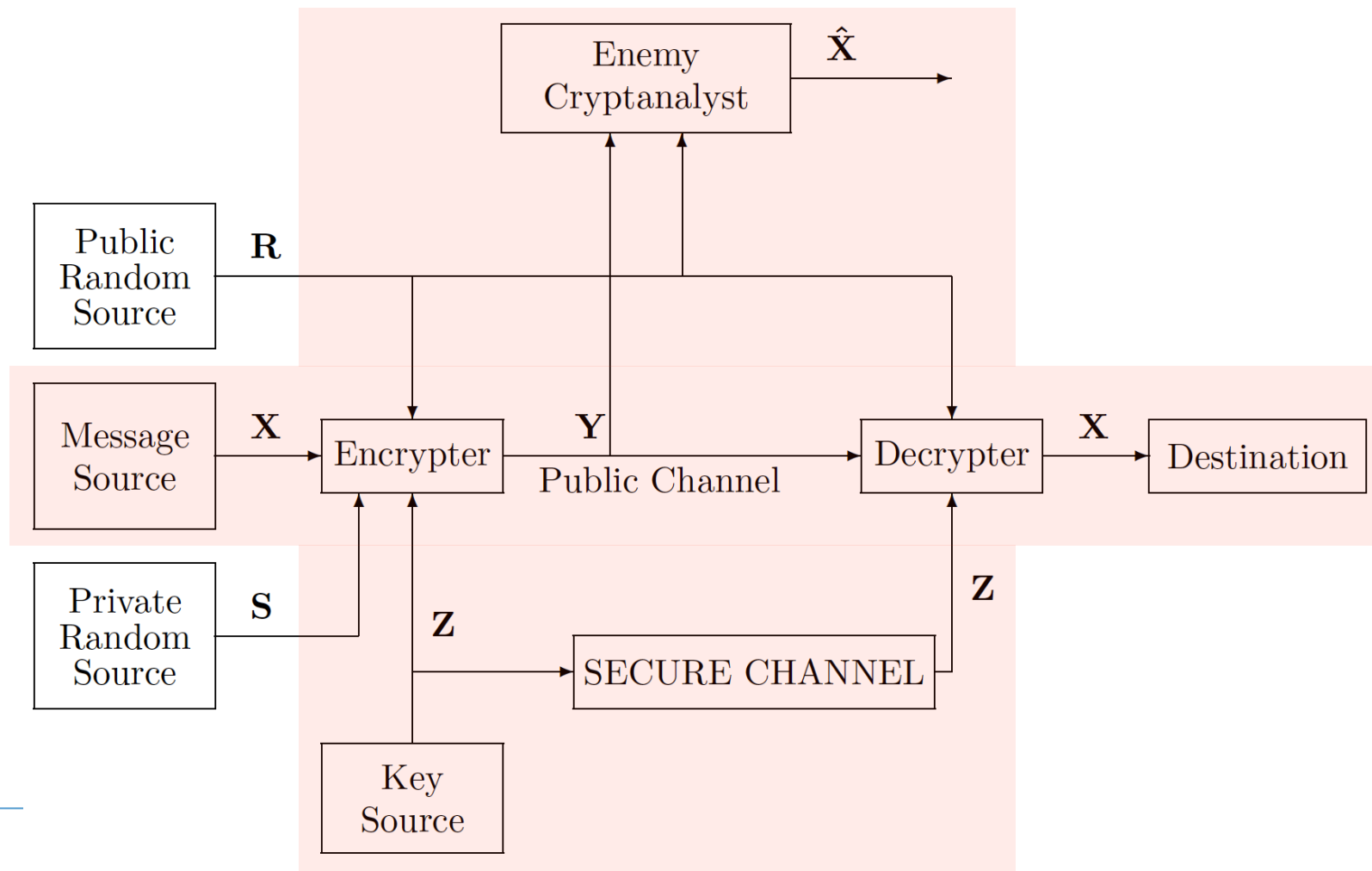
Alexander von Humboldt
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Motivation

- Example 1: Shannon's schematic of a general secrecy system (Communication Theory of Secrecy Systems, BLTJ, 1949)



- Example 2: Massey's general model of a secrecy-key cryptosystem (ADIT 2 – ETH Course Notes 1981-97)



- Example 3: Wyner's Wiretap Channel

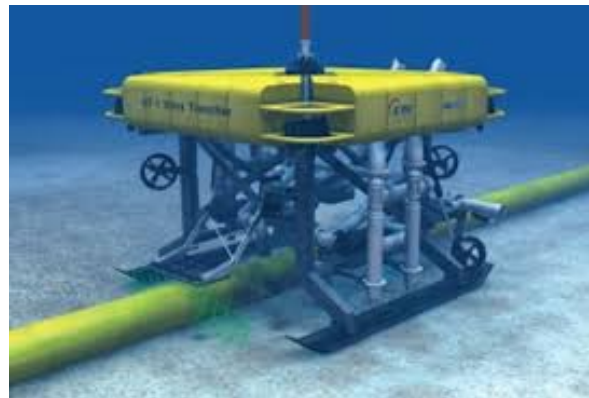
Source



Private Data



Wiretap



Private Data

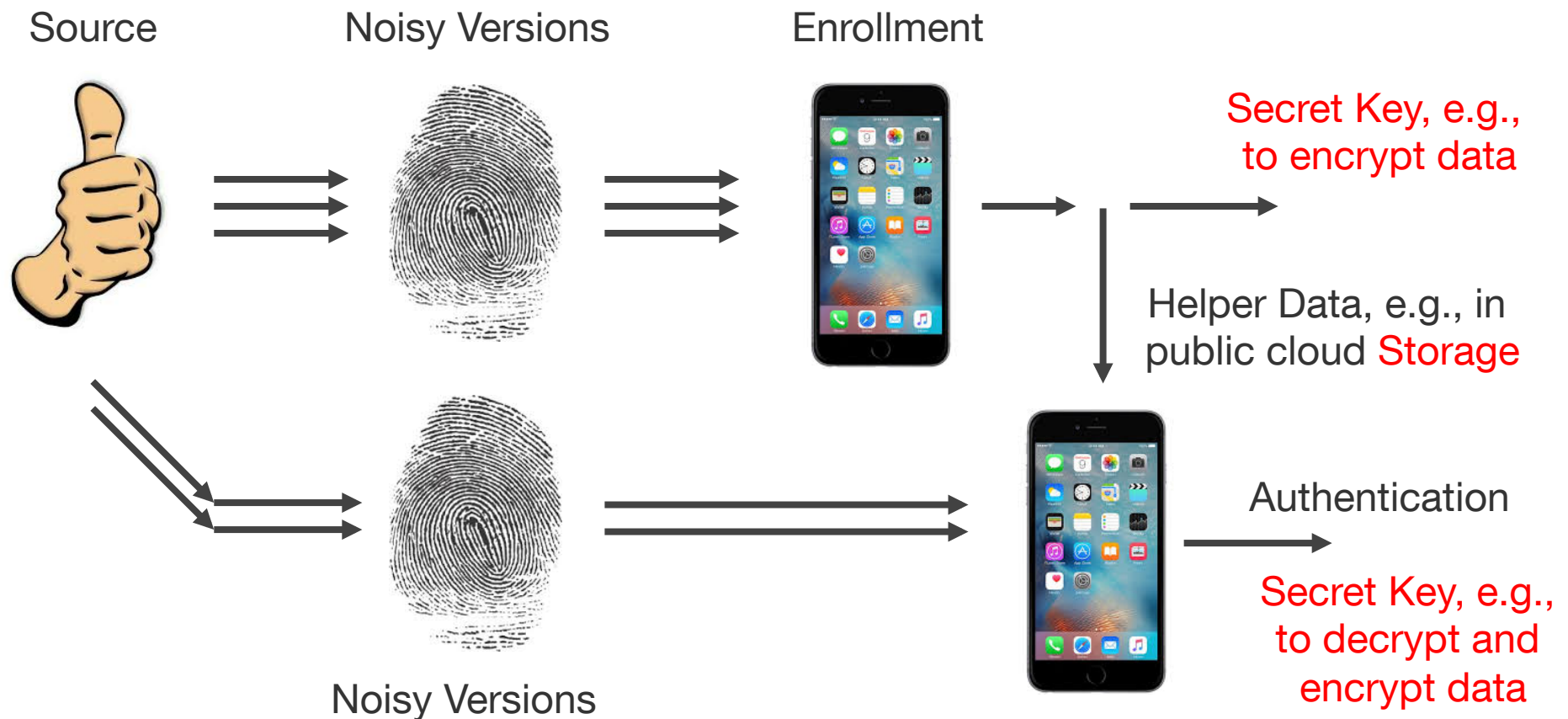


Destination

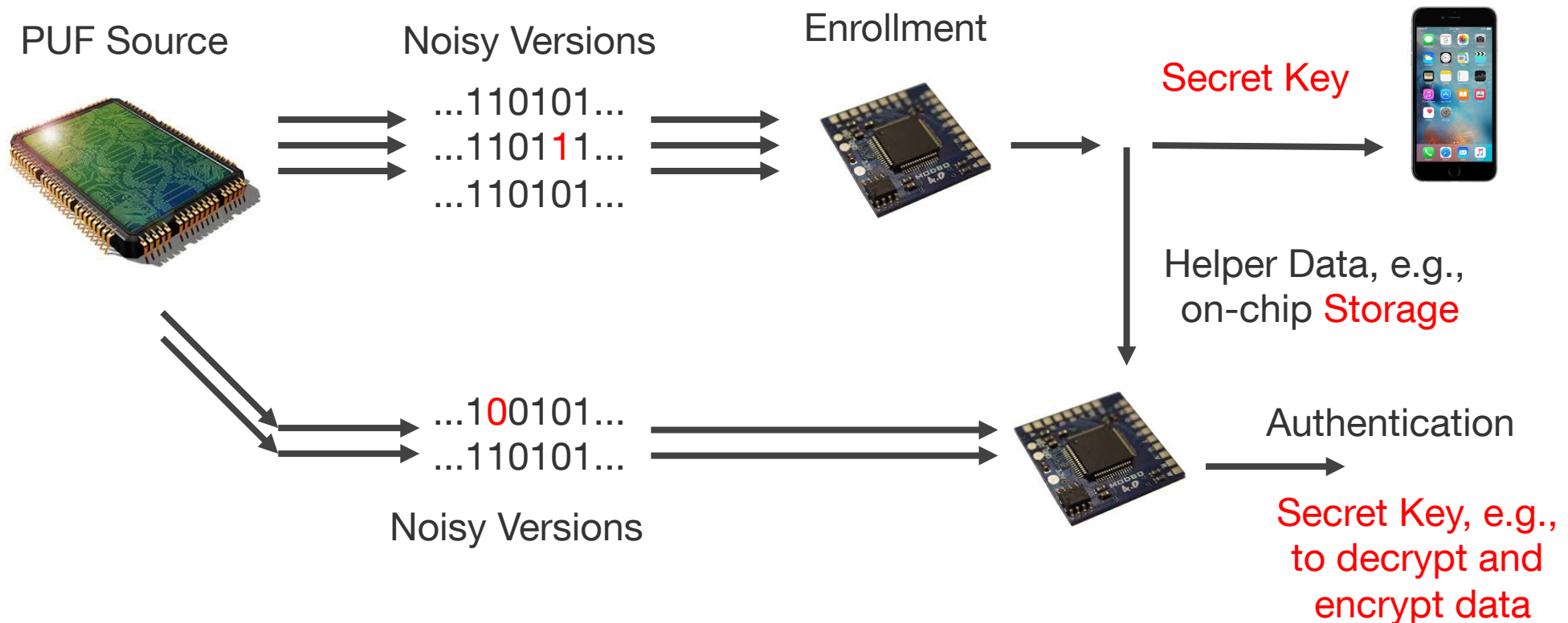


Wiretapper
wants the **Data**

- Example 4: Biometric Security

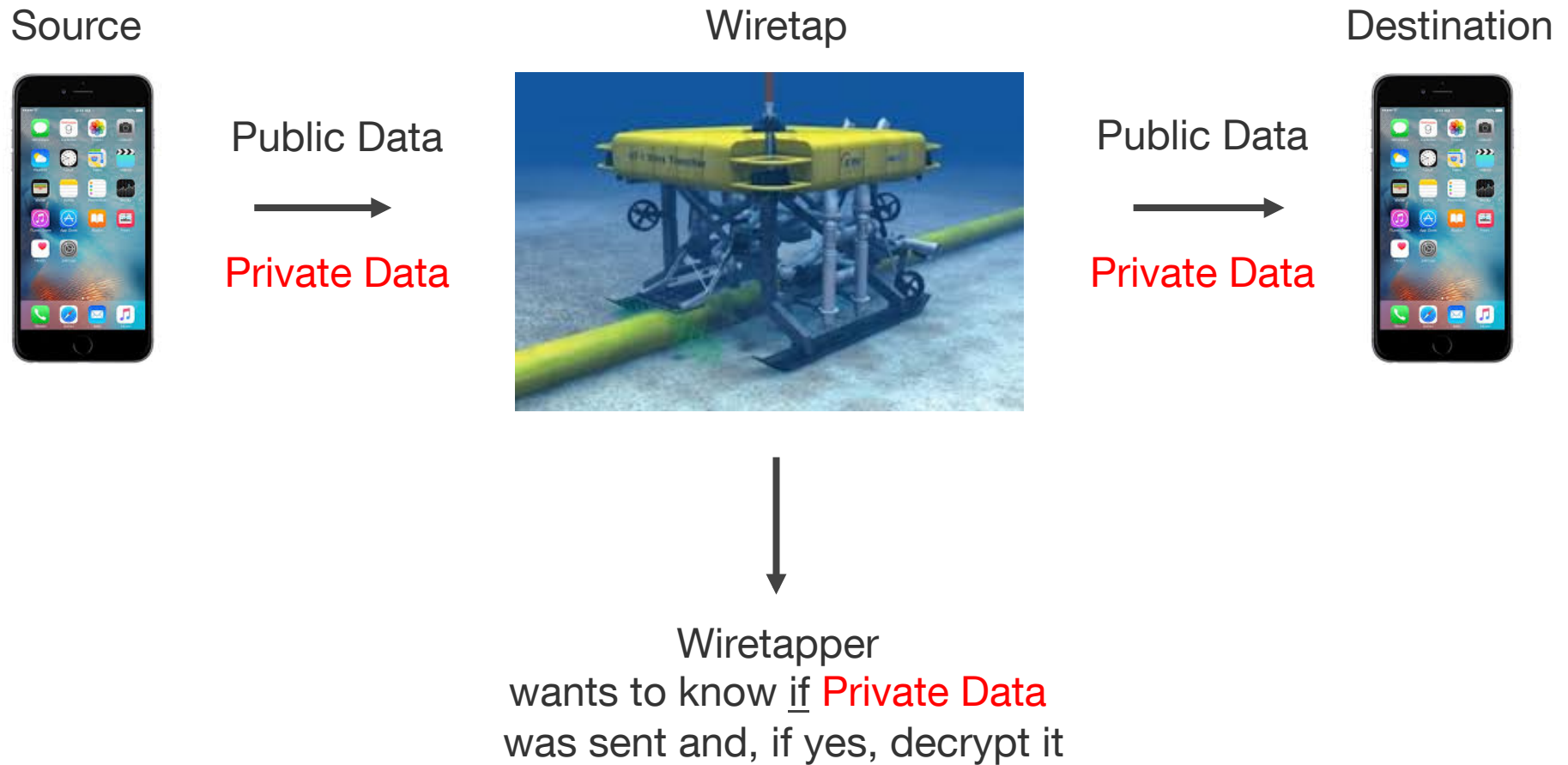


- Example 5: Device Security for Things and their Internet, Hardware “Fingerprint” via a PUF*



* Physical Unclonable Function

- Example 6: Wiretap Channel with a New Requirement



- Low Probability of Intercept (LPI):* communication methods whose primary purpose is to prevent an unauthorized listener from determining the **presence** or location of the transmitter, in order to decrease the possibility of both electronic attack (jamming) and physical attack



* Based on Prescott 1993 (AFSOR Grant #AFOSR-91-0018)

- Four sequential operations that exploitation systems attempt to perform:
 - 1) Cover:** a receiver is tuned to frequencies occupied by a signal of interest
 - 2) Detect:** decide whether the signal is **data** plus noise and interference or just noise and interference.
 - 3) Intercept:** extract features of the signal to determine if it is interesting
 - 4) Exploit:** extract signal features as necessary and demodulate the baseband signal to generate a stream of (meaningful) binary digits.
- Interpretation: 4) deals with **secrecy** and 2) and/or 3) deal with **stealth**
- Example of 2): **covert** communication where data signal has **very low** energy
Example of 3): some data signals may be uninteresting (see above)



Part 1:
Secrecy and Stealth
for Wiretap Channels

Information Theory and “Basic” Models

Information Theory

- Entropy:**

$$H(X) = \sum_{a \in \text{supp}(P_X)} -P_X(a) \log P_X(a) = \mathbb{E}[-\log P_X(X)]$$

$$H(X|Y) = \sum_{ab \in \text{supp}(P_{XY})} -P_{XY}(ab) \log P_{X|Y}(a|b)$$

- Mutual Information and Informational Divergence:**

$$I(X;Y) = D(P_{XY} \parallel P_X P_Y)$$

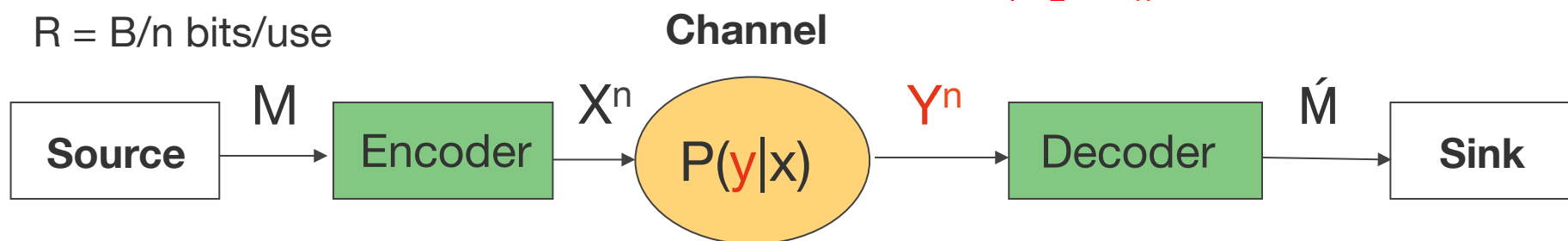
$$= \sum_{ab \in \text{supp}(P_{XY})} P_{XY}(ab) \log \frac{P_{XY}(ab)}{P_X(a)P_Y(b)} = \mathbb{E} \left[\log \frac{P_{XY}(XY)}{P_X(X)P_Y(Y)} \right]$$

Shannon's Channel Coding

B message bits
n channel uses
 $R = B/n$ bits/use

$$X^n = X_1 X_2 \dots X_n$$

$$Y^n = Y_1 Y_2 \dots Y_n$$

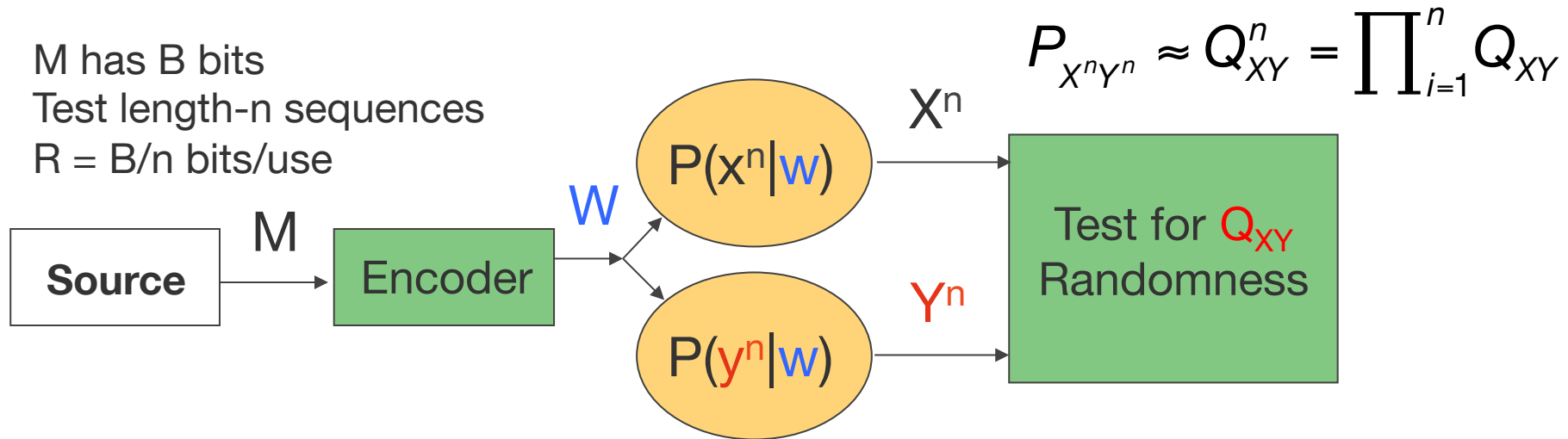


- Problem: find the **maximum** R for **reliable** communications:
small $\Pr[M \neq \hat{M}]$
- Random coding: choose each letter $x_i(m)$ independently via P_x
- Shannon's **Capacity** Function:

$$C = \max_{P_x} I(X; Y)$$

Common Information*

M has B bits
 Test length-n sequences
 $R = B/n$ bits/use



- Problem: find the **minimum R and** channels $P(x^n|w)$, $P(y^n|w)$ so that

$$\frac{1}{n} D(P_{X^n Y^n} \parallel Q_{XY}^n) \leq \varepsilon \text{ for } \varepsilon > 0$$

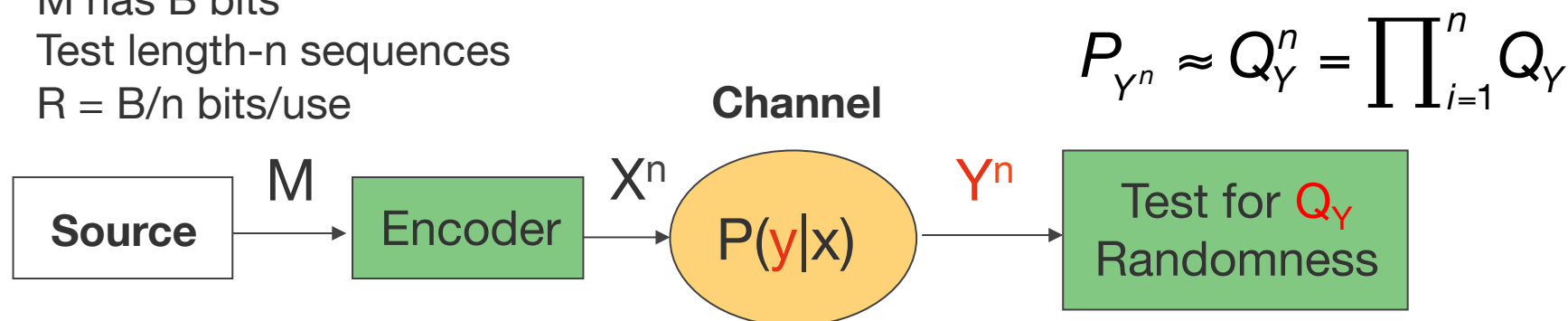
- Result:

$$R = \min_{P_V P_{X|V} P_{Y|V} : P_{XY} = Q_{XY}} I(V; XY)$$

* Wyner 1975; above is the 2nd of Wyner's two approaches

Resolvability*

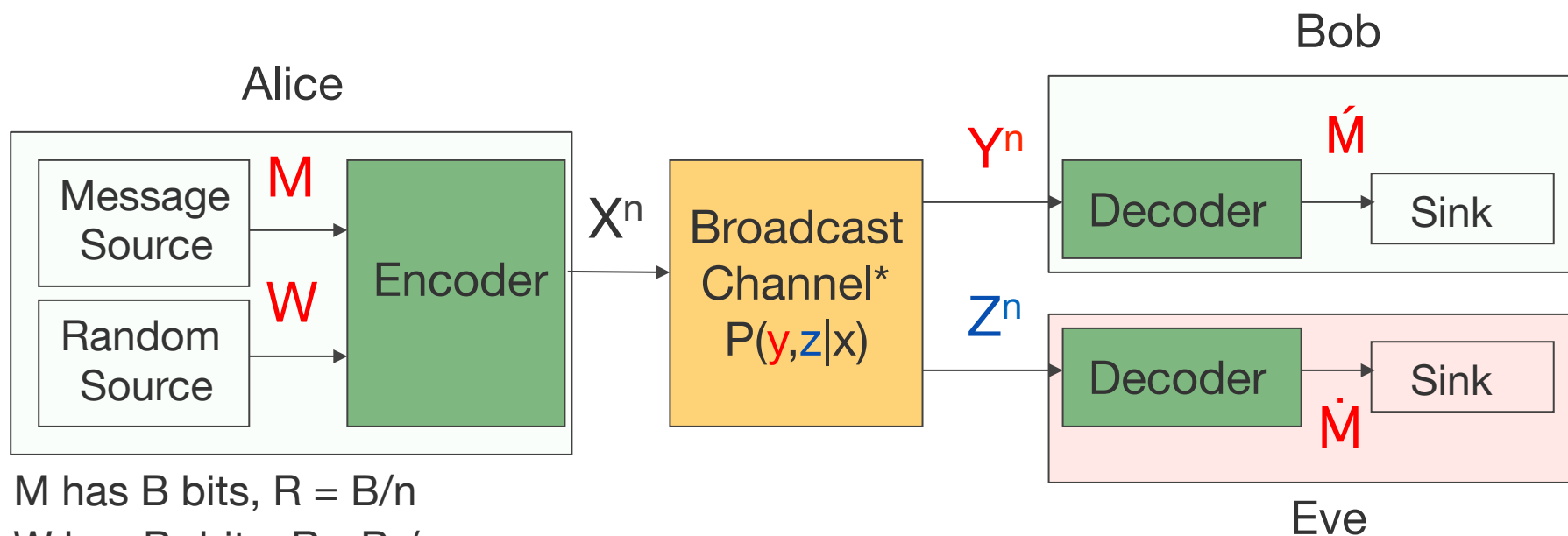
M has B bits
 Test length-n sequences
 $R = B/n$ bits/use



- Problem: find the **minimum** R so that $D(P_{Y^n} \| Q_Y^n) \leq \varepsilon$ for any $\varepsilon > 0$
- Random coding: choose each letter $x_i(m)$ independently via P_X
- Result:

$$R = \min_{P_X : P_Y = Q_Y} I(X; Y)$$

* Han-Verdú 1993 used variational distance $d_v = \|P_{Y^n} - P_Y^n\|_1$; For un-normalized divergence see, e.g., Winter 2005, Hayashi 2006, Watanabe-Oohama 2012, Hou-Kramer 2013



M has B bits, $R = B/n$

W has B_1 bits, $R_1 = B_1/n$

- Requirements: high rate R and
 - **Reliability**: error probability $P_e = \Pr[\hat{M} \neq M]$ should be **small**
 - **Confusion/Secrecy**: M should be “almost independent” of Z^n
 - **Stealth/Covert**: Z^n should “look like” a default Q_{Z^n} , typically an **i.i.d.** sequence of letters

Security Measures for Secrecy and Stealth

- **Equivocation*** (used by Wyner): $\Delta = \frac{1}{B} H(M | Z^n) = \frac{1}{nR} H(M | Z^n)$

Goal: make Δ , $0 \leq \Delta \leq 1$, as large as possible

Note: for $\Delta=1-\varepsilon$ get growing leakage $B\varepsilon$

- Alternatively: make $1-\Delta$ as small as possible. If $H(M)=B$ then

$$1 - \Delta = \frac{1}{B} (H(M) - H(M | Z^n)) = \frac{1}{B} I(M; Z^n)$$

- **Weak secrecy:** $I(M; Z^n)/B$ or $I(M; Z^n)/n$

* to use unclear language to deceive

- **Weak secrecy**: $I(M; Z^n)/B$ or $I(M; Z^n)/n$
- Criticism: if we fix the ratio then more bits leak as B grows. So perhaps we want an absolute measure.
- **Strong secrecy***: $I(M; Z^n)$
- Remark: the approaches are effectively the same if we fix B
- **Alternative**** : measure variational distance $d_v = \left\| P_{MZ^n} - P_M P_{Z^n} \right\|_1$ and use** ($B \geq 2$, say d_v decreases faster than $1/B$)
$$\frac{d_v^2}{2 \ln 2} \leq I(M; Z^n) \leq d_v \log_2 \frac{2^B}{d_v}$$
- Most IT (and CS) papers since 1993 use d_v rather than $I(M; Z^n)$, which is somewhat strange

* Maurer 1993; Ahlswede-Csiszár 1993; ** Csiszár 1996

- **Strong secrecy:** $I(M; Z^n) = D(P_{MZ^n} \parallel P_M P_{Z^n})$

- **Stealth:** $P_{Z^n} \approx Q_{Z^n}$ for some "default" Q_{Z^n}

- **Effective secrecy**^{*}: replace the last P with Q

$$D(P_{MZ^n} \parallel P_M Q_{Z^n}) = \left\{ H(M) - E \left[\log(Q_{Z^n}(Z^n)) \right] \right\} - H(MZ^n)$$

$$= I(M; Z^n) + D(P_{Z^n} \parallel Q_{Z^n})$$

- Remarks: (1) stronger than strong secrecy that has $Q_{Z^n} = P_{Z^n}$
 (2) can study I & D separately; (3) "better" than var. distance;
 (4) we mainly study $Q_{Z^n} = Q_Z^n$; (5) **worst case** measures exist

* Independently used by Han-Endo-Sasaki 2013

- A natural **worst-case*** rather than an **average** metric is:

$$\max_m D(P_{Z^n|M=m} \| P_{Z^n}) \text{ rather than } I(M;Z^n)=D(P_{Z^n|M} \| P_{Z^n} | P_M)$$

- So a natural **worst-case** metric for us is (Q replaces P):

$$\max_m D(P_{Z^n|M=m} \| Q_{Z^n}) \text{ rather than } D(P_{Z^n|M} \| Q_{Z^n} | P_M)$$

- Remark: for design we wish to know how fast d_v or D approach zero with n , and not only the limit
- But we know that exponential dependence on n is possible
 \Rightarrow Should consider reasonable block length and **code design**

* Use standard expurgation arguments; valid for non-uniform **M**

- **Semantic Security*** (Goldwasser & Micali 1984): based on Turing machines (other definitions: indistinguishability, non-malleability, non-dividability, etc.)
- Uses worst-case “advantage”: consider g at Eve, h_r random

$$Adv = \max_{f,m} \left\{ \max_g \Pr \left[g(Z^n) = f(m) \right] - \max_h \Pr \left[h_r(B) = f(m) \right] \right\}$$

* Wikipedia: A cryptosystem is semantically secure if any **probabilistic, polynomial-time algorithm (PPTA)** that is given the ciphertext of a certain message m (taken from any distribution of messages), and the message's length, cannot determine any partial information on the message with probability non-negligibly higher than all other PPTA's that only have access to the message length (and not the ciphertext)

Capacity

- **Result***:
$$C = \max_{P_{VX} : P_Z = Q_Z} [I(V;Y) - I(V;Z)]$$

where chain $V-X-YZ$ is Markov. The cardinality $|V|$ is at most $|X|$.

- **Remarks:**
 - C has same form as secrecy capacity except for the constraint
 - **Stealth:** if possible, choose Q_Z to maximize secrecy rate, i.e., as default send i.i.d X_i with P_X that maximizes the secrecy rate
 - Results extend to continuous-alphabet channels
 - **Common complaint:** $C=0$ if Bob's channel is worse than Eve's. How can we be sure this does not happen in practice?
Reply 1: this can be reasonable
Reply 2: the methods will improve security in any case

- Further Remarks:

- C depends on $P(y|x)$ and $P(z|x)$ only, not on “all” of $P(y,z|x)$
- Physically** degraded channel: chain X - Y - Z is Markov and thus

$$I(V;Y) - I(V;Z) = H(V|Z) - H(V|Y)$$

$$= I(V;Y|Z) \quad \dots \text{ why?}$$

$$\leq I(X;Y|Z) \quad \dots \text{ why?}$$

$$= I(X;Y) - I(X;Z) \quad \dots \text{ why?}$$

- Implication: best V is X
- Stochastically** degraded channel has $P(y,z|x)$ where $P(y|x)$ and $P(z|x)$ are those of a physically degraded channel
- Implications: same capacity C , and the best V is X

$$C = \max_{P_X : P_Z = Q_Z} [I(X;Y) - I(X;Z)]$$

- **BSCs:** $Y = X \oplus A_1, \quad Z = X \oplus A_2$

where $\Pr[A_1=1]=p_1, \Pr[A_2=1]=p_2, p_1 \leq p_2 < 0.5$

- Channel is stochastically degraded (why?) so that best **V** is X

- **Stealth:** suppose we require $Q_Z(1)=q$ where $p_2 \leq q \leq (1-p_2)$

We have* (try $q=1/2$ and $q=p_2$):

$$q = P_Z(1) = (1 - P_X(1))p_2 + P_X(1)(1 - p_2) \Rightarrow P_X(1) = \frac{q - p_2}{1 - 2p_2}$$

$$C = H_2(p_2) - H_2(p_1) - H_2(q) + H_2\left(\left(q - p_2\right)\frac{1 - 2p_1}{1 - 2p_2} + p_1\right)$$

* $H_2(p) = -p \log_2 p - (1-p) \log_2(1-p)$

$$C = \max_{P_X : P_Z = Q_Z} [I(X;Y) - I(X;Z)]$$

- **AWGN Channels:** $Y = X + A_1, \quad Z = X + A_2$

where $A_1 \sim \mathcal{N}(0, N_1), A_2 \sim \mathcal{N}(0, N_2), 0 \leq N_1 \leq N_2$

- Channel is stochastically degraded (why?) so that best V is X
- **Stealth:** suppose we require $Z \sim \mathcal{N}(0, Q)$ where $N_2 \leq Q \leq P + N_2$
We have $X \sim \mathcal{N}(0, Q - N_2)$ and

$$C = \frac{1}{2} \log \left(1 + \frac{Q - N_2}{N_1} \right) - \frac{1}{2} \log \left(\frac{Q}{N_2} \right)$$

- Secrecy and covert capacities: $Q = P + N_2$ and $Q = N_2$, respectively

Proofs

Warning: lots of equations!

- Choose a P_X . Consider Shannon random coding experiment.
- Classic methods give $E[P_e | M=m, W=w] \rightarrow 0$ if $n \rightarrow \infty$ and

$$R + R_1 < I(X; Y)$$

- For secrecy & stealth, consider the following **direct** proof*:

$$D(P_{MZ^n | \text{Code}} \| P_M Q_{Z^n}) = I(M; Z^n | \text{Code}) + D(P_{Z^n | \text{Code}} \| Q_{Z^n})$$

$$D(P_{Z^n | M=m, \text{Code}} \| Q_{Z^n}) = \sum_{w=1}^{2^{B_1}} \frac{1}{2^{B_1}} E \left[\log \frac{\sum_{j=1}^{2^{B_1}} P_{Z|X}^n(Z^n | X^n(m, j))}{2^{B_1} Q_{Z^n}(Z^n)} \middle| M = m, W = w \right]$$

* Hou-Kramer 2013; cf. Cuff 2009 and Yassaee 2013 who use concavity of x^2 for var. distance

- For a fixed z^n we have:

$$E \left[P_{Z|X}^n \left(z^n | X^n(m, j) \right) \right] = P_Z^n \left(z^n \right)$$

- Using the concavity of $\log(\cdot)$ and Jensen's inequality for the expectation over the code words $X^n(m, j)$ with $j \neq w$, we have

$$\begin{aligned} & D \left(P_{Z^n | M=m, \text{Code}} \parallel Q_{Z^n} \right) \\ & \leq \sum_{w=1}^{2^{B_1}} \frac{1}{2^{B_1}} E \left[\log \left(\frac{P_{Z|X}^n \left(Z^n | X^n(m, w) \right)}{2^{B_1} Q_{Z^n} \left(Z^n \right)} + \frac{P_Z^n \left(Z^n \right)}{Q_{Z^n} \left(Z^n \right)} \right) \middle| M = m, W = w \right] \end{aligned}$$

- Alternatively, we have

$$D\left(P_{Z^n|M=m, \text{Code}} \parallel Q_{Z^n}\right) \leq E \left[\log \left(\frac{P_{Z|X}^n(Z^n|X^n)}{2^{B_1} P_Z^n(Z^n)} + 1 \right) \right] + D\left(P_Z^n \parallel Q_{Z^n}\right)$$

- Keeping only δ -typical sequences, we “basically” have

$$D\left(P_{Z^n|M=m, \text{Code}} \parallel Q_{Z^n}\right) \leq \log \left(\frac{2^{-n(1-\delta)H(Z|X)}}{2^{B_1} 2^{-n(1+\delta)H(Z)}} + 1 \right) + D\left(P_Z^n \parallel Q_{Z^n}\right)$$

- As long as $R_1 > I(X; Z)$ and $Q_{Z^n} = P_Z^n$, avg. divergence is small

- Resulting rate bounds:

$$R + R_1 < I(X;Y) \text{ for reliability}$$

$$R_1 > I(X;Z) \text{ for resolvability}$$

which gives:

$$R < I(X;Y) - I(X;Z)$$

- To get capacity:
 - replace X with V and generate code words $V^n(m,w)$
 - For each $V^n(m,w)$ generate $X^n(m,w)$ via **artificial channel*** $P_{X|V}$
- Default behavior for stealth: send i.i.d X_i with distribution P_X

* To reduce # random bits to $n \cdot I(X;Z)$: see Chia-El Gamal 2012 & Watanabe-Oohama 2015

Stealth Converse

- Several steps: $\xi \geq D(P_{MZ^n} \| P_M Q_Z^n) = D(P_{Z^n|M} \| Q_Z^n | P_M)$

$$= \left[\sum_{z^n} P(z^n) \sum_{i=1}^n \log \frac{1}{Q_Z(z)} \right] - H(Z^n | M)$$

$$\geq \sum_{i=1}^n \left[\sum_{z^n} P_{Z_i}(z) \log \frac{1}{Q_Z(z)} \right] - H(Z_i)$$

$$= \sum_{i=1}^n D(P_{Z_i} \| Q_Z)$$

$$\geq nD(P_{Z_T} \| Q_Z) \text{ where } P_T(i) = \frac{1}{n}, i = 1, 2, \dots, n$$

Secrecy Converse (Simplified)

- Main observation: can often replace 2 Csiszár sum identities steps with 1 telescoping identity
- As usual, Fano's inequality gives the first step

$$\begin{aligned} B = H(M) &= I(M; Y^n) + H(M|Y^n) \\ &\leq I(M; Y^n) + (H_2(P_e) + P_e B) \end{aligned}$$

- Requirement $I(M; Z^n) \leq \epsilon n$ (**weak** secrecy) implies:

$$B \leq I(M; Y^n) + (\epsilon n - I(M; Z^n)) + (H_2(P_e) + P_e B)$$

- Now use **telescoping sum**, set $U_i = Y^{i-1}Z_{i+1}^n$ and let T be a **time-sharing** RV and $U_i - X_i - Y_i - Z_i$ forms a Markov chain for all i

$$\begin{aligned}
 & I(M; Y^n) - I(M; Z^n) \\
 &= \sum_{i=1}^n \left[I(M; Y^i Z_{i+1}^n) - I(M; Y^{i-1} Z_i^n) \right] \quad (\text{telescoping}) \\
 &= \sum_{i=1}^n \left[I(M; Y_i | Y^{i-1} Z_{i+1}^n) - I(M; Z_i | Y^{i-1} Z_{i+1}^n) \right] \quad (\text{chain rule}) \\
 &= n \left[I(M; Y_T | U_T T) - I(M; Z_T | U_T T) \right]
 \end{aligned}$$

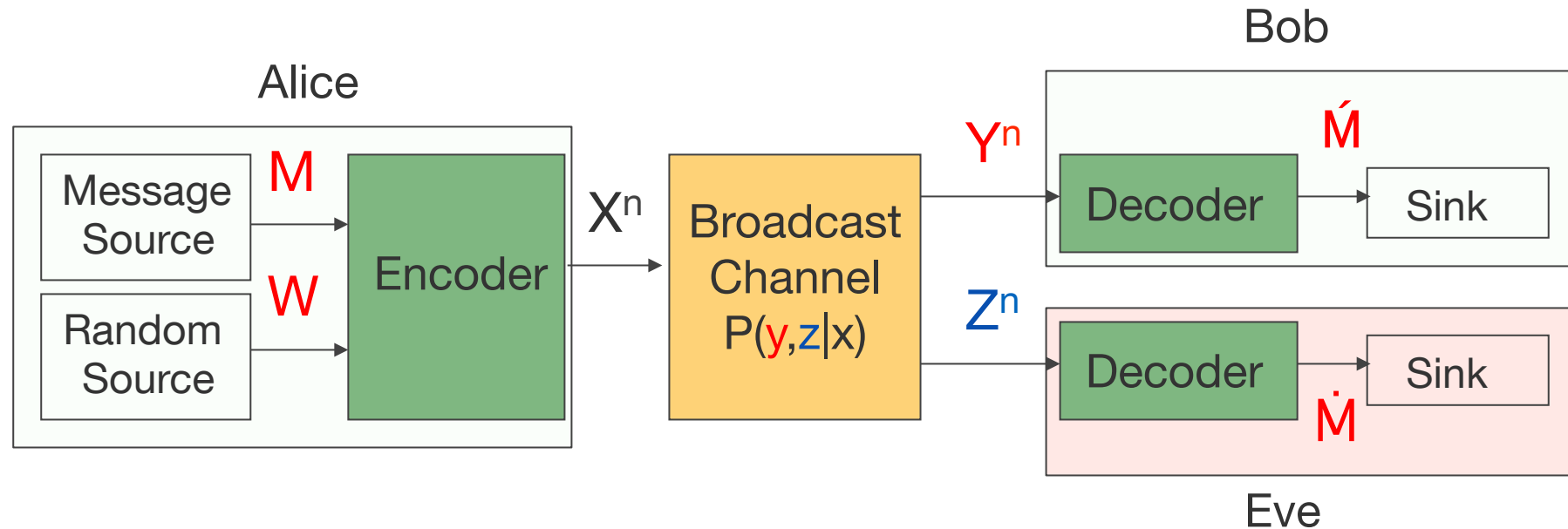
- Final steps*:

$$\begin{aligned}
 & n \left[I(M; Y_T | U_T T) - I(M; Z_T | U_T T) \right] \\
 & \leq \max_u \max_{P_{MX|U}(\cdot|u) \in \Pi} n \left[I(M; Y | U = u) - I(M; Z | U = u) \right] \\
 & = \max_{P_{VX} \in \Pi} n \left[I(V; Y) - I(V; Z) \right] = nC
 \end{aligned}$$

- Result with $B=nR$:
$$R \leq \frac{C + \varepsilon + H_2(P_e)/n}{1 - P_e}$$

* Maximization constraint and cardinality bound follow by other steps

Operational Meaning of Stealth



- Since $D(P_{MZ^n} \| P_M Q_{Z^n}) = I(M; Z^n) + D(P_{Z^n} \| Q_{Z^n})$

effective secrecy implies a small $D(P_{Z^n} \| Q_{Z^n})$

- Operational** meaning? Can extend ideas from **steganography***

- Eve has two hypotheses:

$$H_0 : Q_{Z^n} \text{ (Alice transmits junk)}$$

$$H_1 : P_{Z^n} \text{ (Alice transmits information)}$$

- Error probabilities:

$$\alpha = \Pr[H_1 \text{ accepted} \mid H_0 \text{ is true}] \text{ (false alarm)}$$

$$\beta = \Pr[H_0 \text{ accepted} \mid H_1 \text{ is true}] \text{ (mis-detection)}$$

- Neyman-Pearson: test the ratio $Q_{Z^n}(z^n)/P_{Z^n}(z^n)$
- The set of z^n where H_0 is accepted:

$$A_F^n = \left\{ z^n : \frac{Q_{Z^n}(z^n)}{P_{Z^n}(z^n)} > F \right\}$$

- Error probabilities again:

$$\alpha = 1 - Q_{Z^n}(A_F^n) \quad (\text{false alarm})$$

$$\beta = P_{Z^n}(A_F^n) \quad (\text{mis-detection})$$

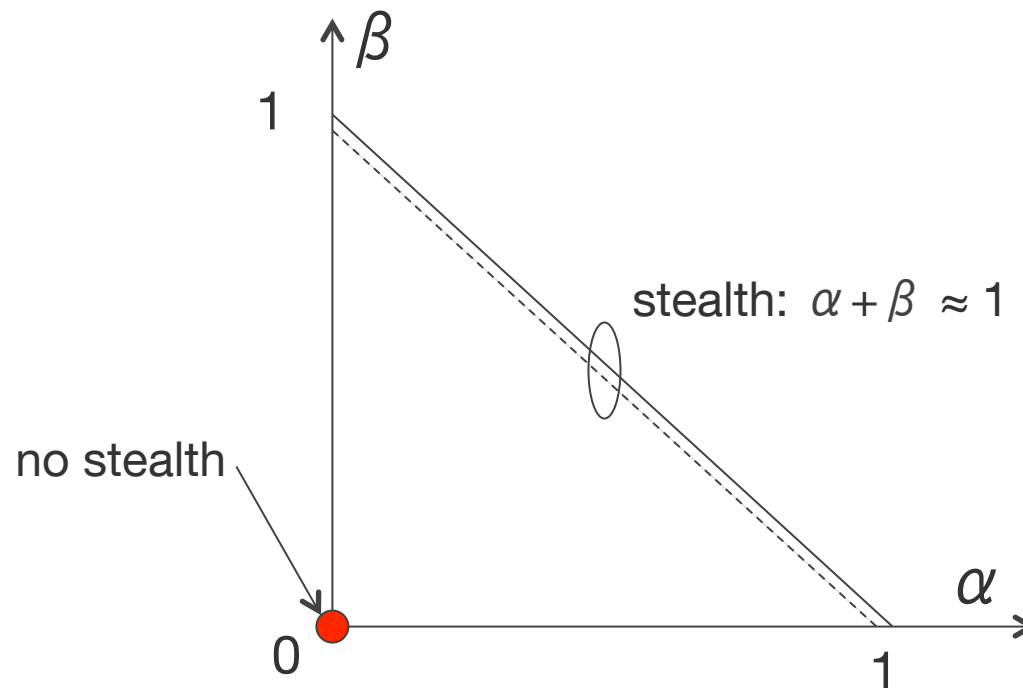
- Using Pinsker's inequality, we have

$$\begin{aligned} \sqrt{2 \ln 2 \cdot D(P_{Z^n} \| Q_{Z^n})} &\geq \|P_{Z^n} - Q_{Z^n}\|_1 \\ &\geq \sum_{z^n \in A_F^n} |P_{Z^n}(z^n) - Q_{Z^n}(z^n)| \geq \left| \sum_{z^n \in A_F^n} P_{Z^n}(z^n) - Q_{Z^n}(z^n) \right| \\ &\geq |P_{Z^n}(A_F^n) - Q_{Z^n}(A_F^n)| = |\beta - (1 - \alpha)| \end{aligned}$$

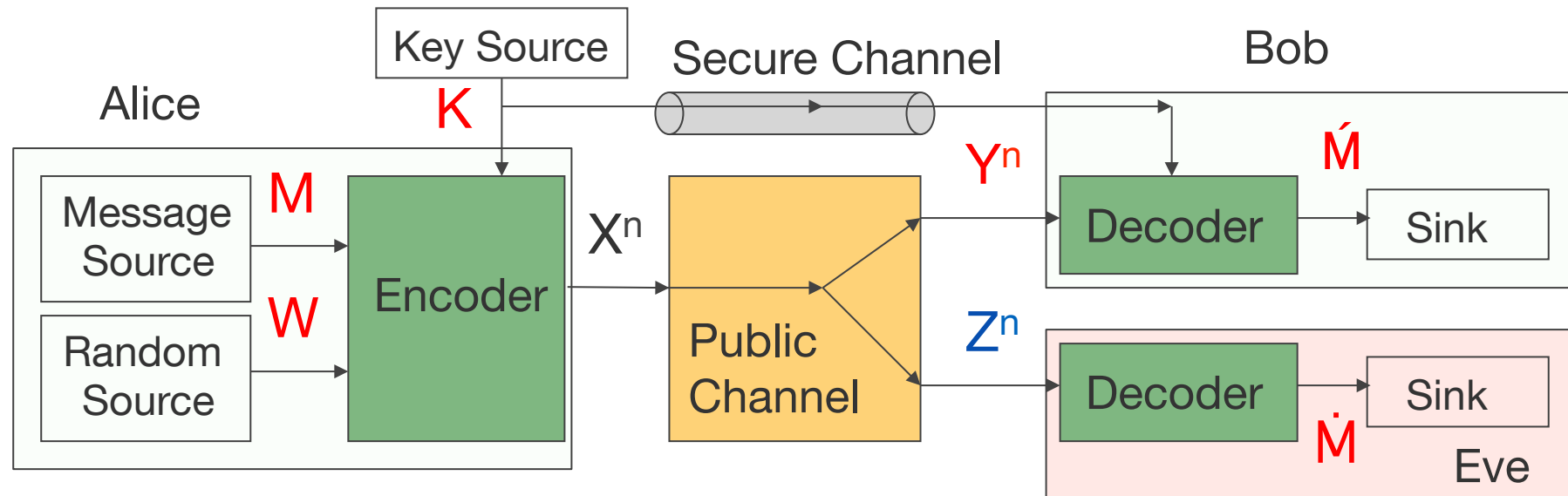
- Thus, small $D(P_{Z^n} \| Q_{Z^n})$ means small $|\beta - (1 - \alpha)|$
or

$$\alpha + \beta \approx 1$$

- But then Eve may as well **guess** without observing Z^n

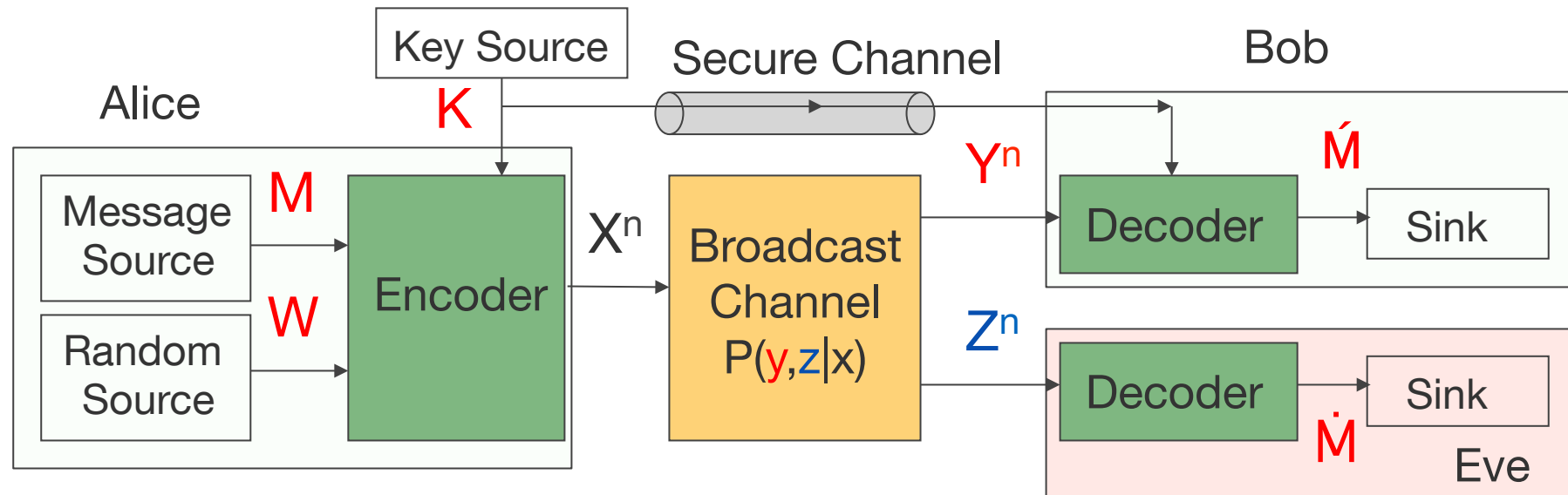


Other Stealth/Covert Models



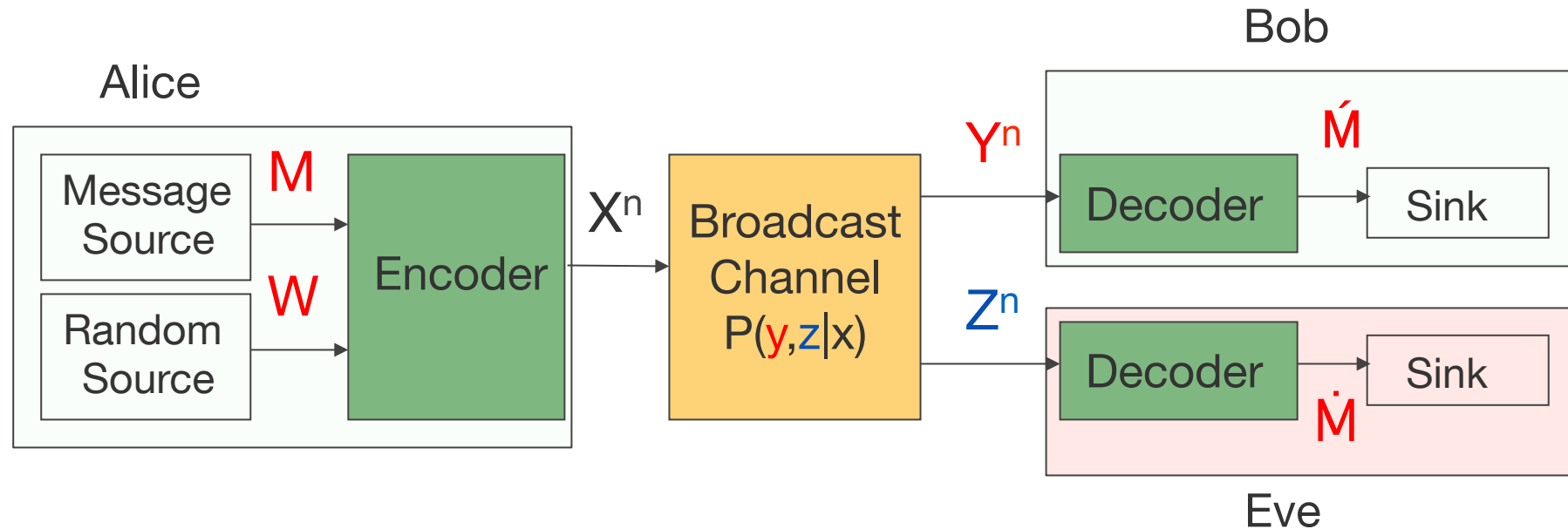
- An **IT steganography** model*: Alice sends either (1) **embedded** message $M=E$ via **stegotext** $X^n=S^n$ or (2) an open message via **coverttext** $X^n=C^n$
- Require: (1) encoder does not know P_E (universality); (2) $I(\hat{E};E)>0$; (3) Bob knows when Alice is active; (4) secrecy via one-time pad**
- Limitations: (1) measure stealth via **normalized** divergence $D(P_{C^n} \| P_{S^n})/n$ (2) Universality only if $H(E)$ is below threshold and rate loss is permitted

* Cachin 2004; ** secrecy for free



- Low probability of detection (LPD)*: AWGN channel, Q_{Z^n} chosen for $X^n=0^n$
- Secret key: $B_K \sim n^{1/2} \log(n)$ bits* ... in fact, $n \cdot [I(X;Y) - I(X;Z)] \leq c \cdot n^{1/2}$ bits suffice
- Measure stealth via **un-normalized** $D(P_{Z^n} \parallel Q_{Z^n})$; note swap of cover/stegotext
- Result*: a **square-root law** due to local quadratic nature of divergence
- Result**: for BSCs, no need for **K** if Bob has a better channel than Eve (i.e., $nI(X;Z)$ “deniability”) but rate depends on channel differences

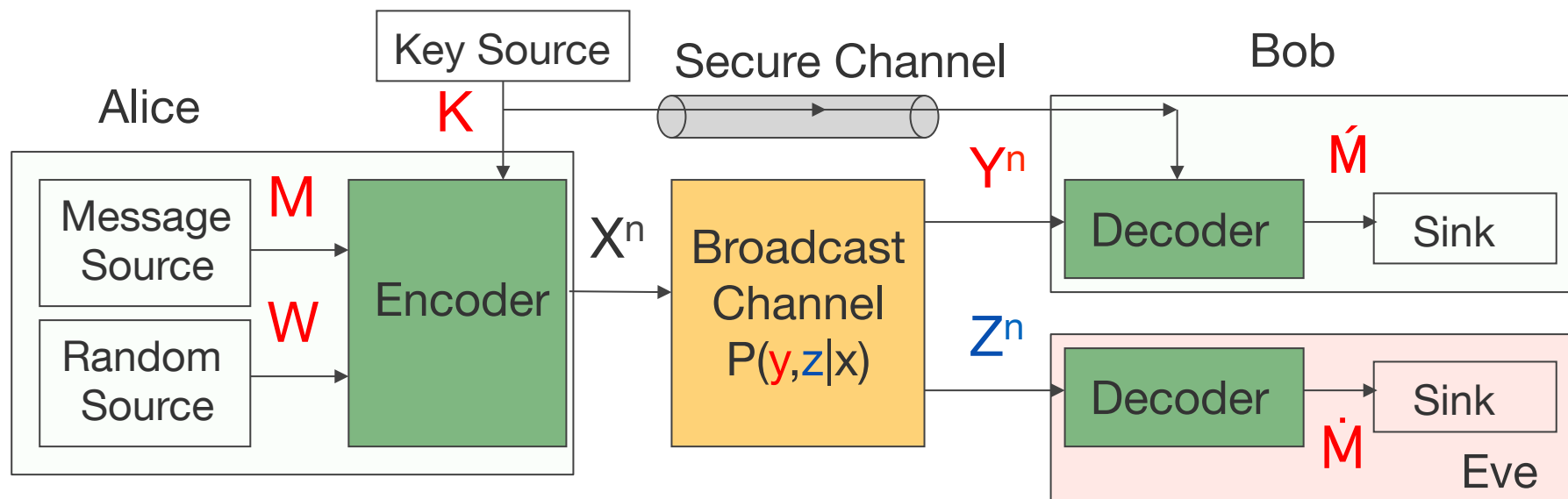
* Bash-Goeckel-Towsley 2012; ** Che-Bakshi-Jaggi 2013



- Consider (1) reliability; (2) secrecy; (3) stealth **at the same time***
- **Break*** the square-root law if default (covertext) behavior is $X^n \neq 0^n$
- Other work: (1**) BSCs, variational distance, **weak** secrecy ($n^{1/2}$ normalization) (2***) noiseless compound channels; a “hidability” secrecy criterion uses probability ratios (worst case analysis similar to semantic security)

* Hou-Kramer 2013; Hou Dr. Ing. Thesis 2014;

** Che-Bakshi-Chan-Jaggi 2014; ***Kadhe-Bakshi-Jaggi-Sprintson 2014



- Input* and output cost constraints (*Han-Endo-Sasaki 2013)
- Broadcast channel with a confidential message: add common message
- Secret key K with key rate** R_K ... security even if Ross has a better channel:

$$C = \max_{P_{VX} : P_Z = Q_Z} \left[I(V; Y) - \max(0, I(V; Z) - R_K) \right]$$

** replace W bits with K bits; leads to at most $n^{1/2}$ bits for LPD

Effective secrecy*

- includes the notion of **stealth/covert** communication;
- proofs use simple steps only

For more information, please see

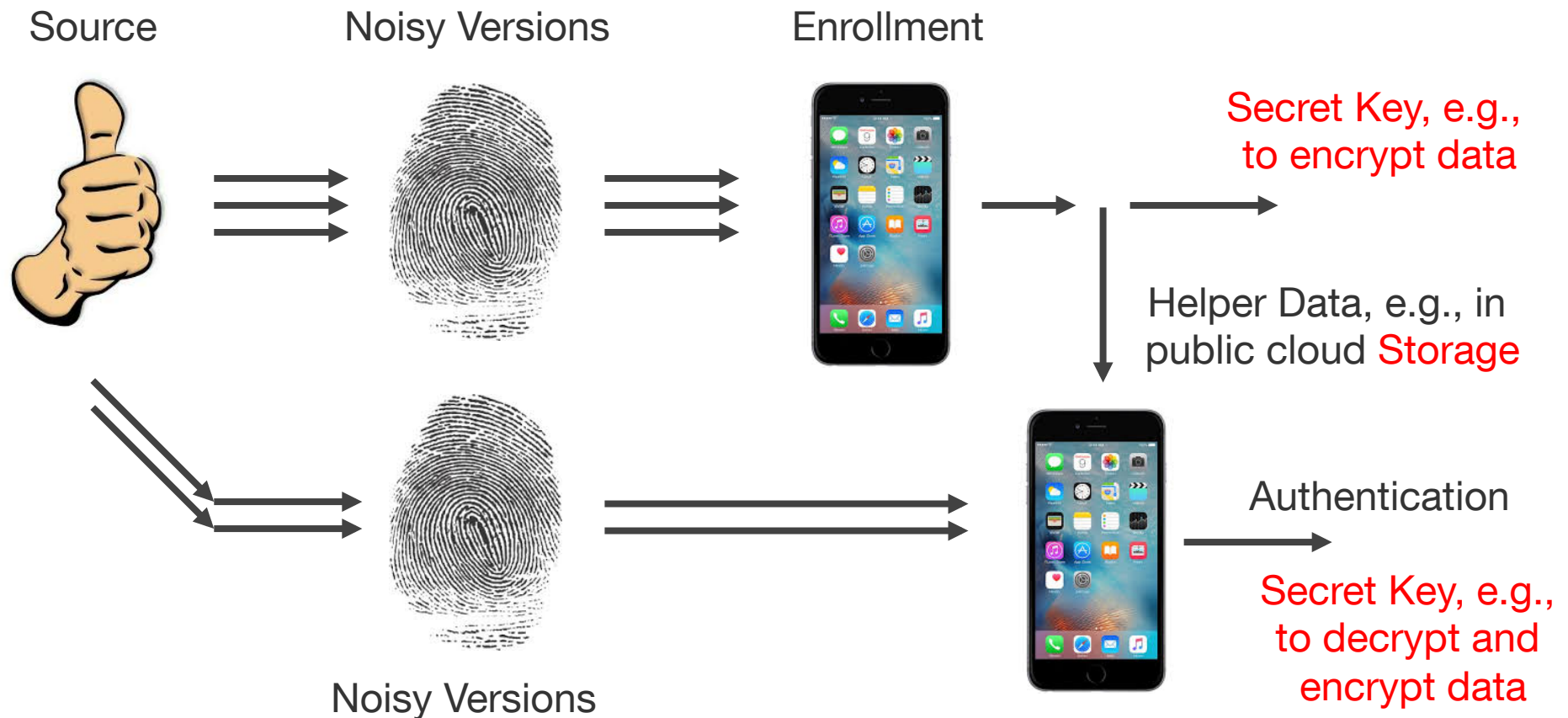
- J. Hou, “Coding for Relay Networks and Effective Secrecy for Wire-tap Channels”, Dr. Ing. Dissertation, TUM, Germany, 2014
- J. Hou and G. Kramer, “Effective secrecy: reliability, confusion and stealth,” arXiv:1311.1411, 2013 and 2014

* Independently introduced by Han-Endo-Sasaki 2013

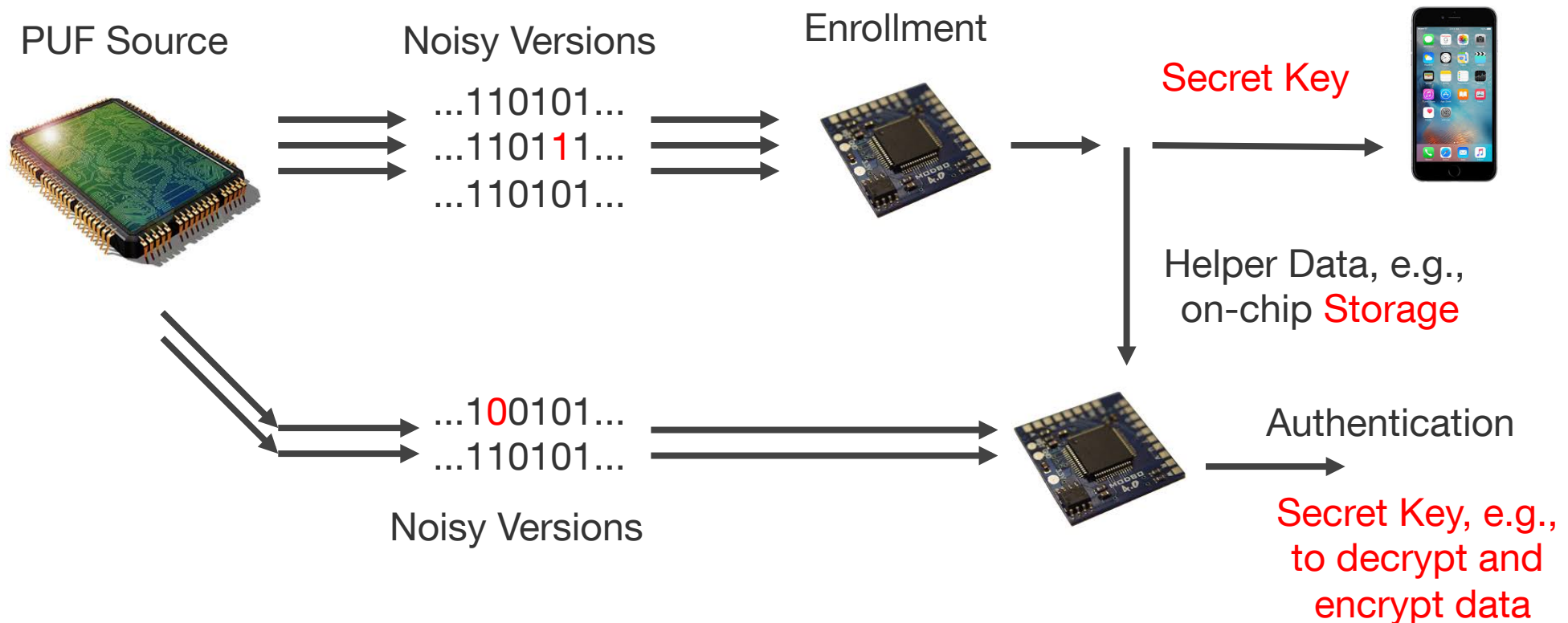
Part 2:
Secrecy, Privacy, and Storage
for Noisy Identifiers

Motivation (Again) and Model

■ Example A: Biometric Security

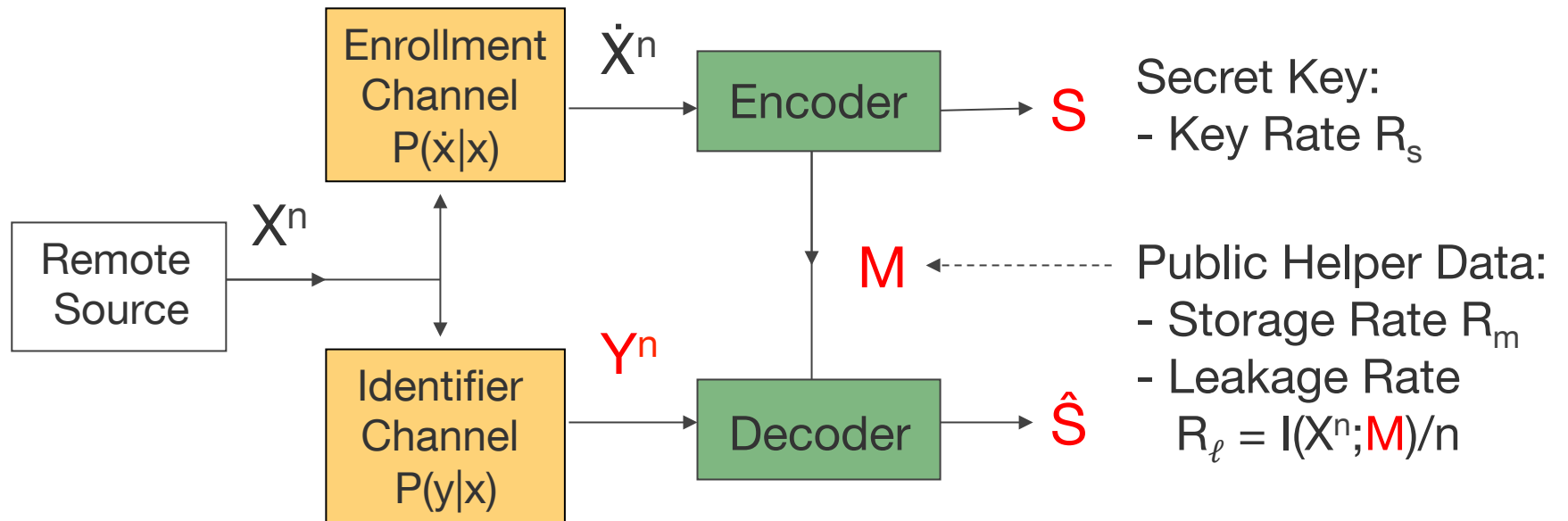


- Example B: Device Security for Things and their Internet, Hardware “Fingerprint” via a PUF*



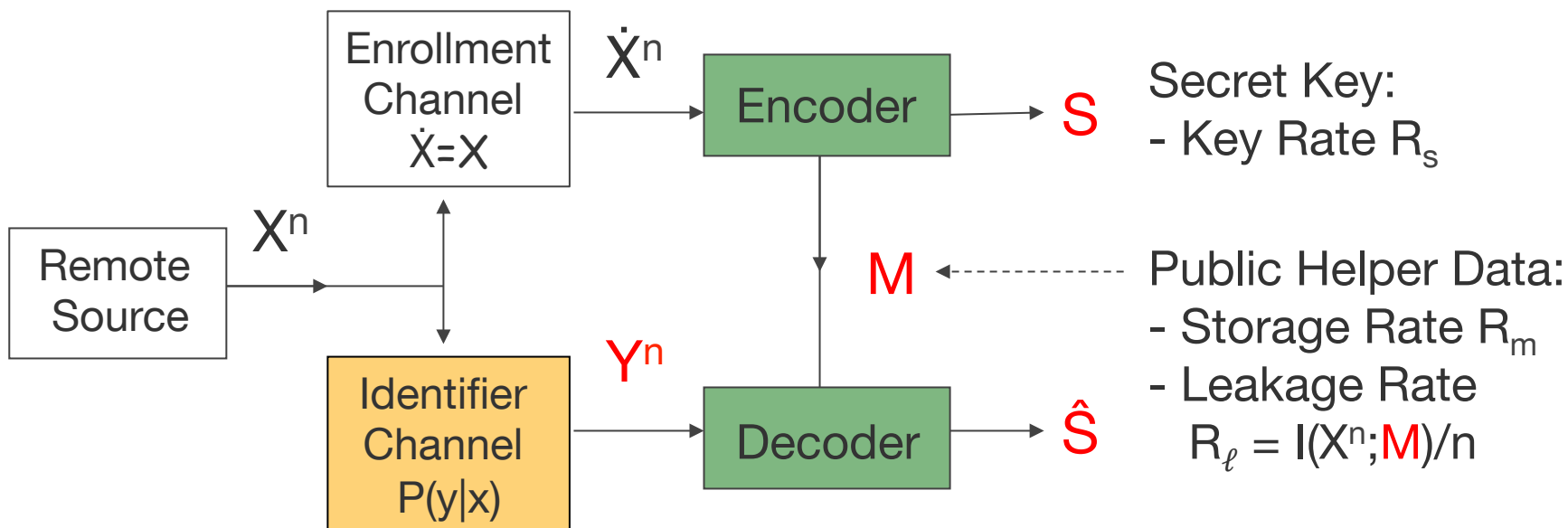
* Physical Unclonable Function

Noisy Identifier Model*



- Requirements:
 - **Reliability**: error probability $P_e = \Pr[\hat{S} \neq S]$ should be **small**
 - **Secrecy**: S should be independent of M and R_s **large**
 - **Privacy**: leakage rate R_ℓ should be **small**
 - **Storage**: storage rate R_m should be **small**

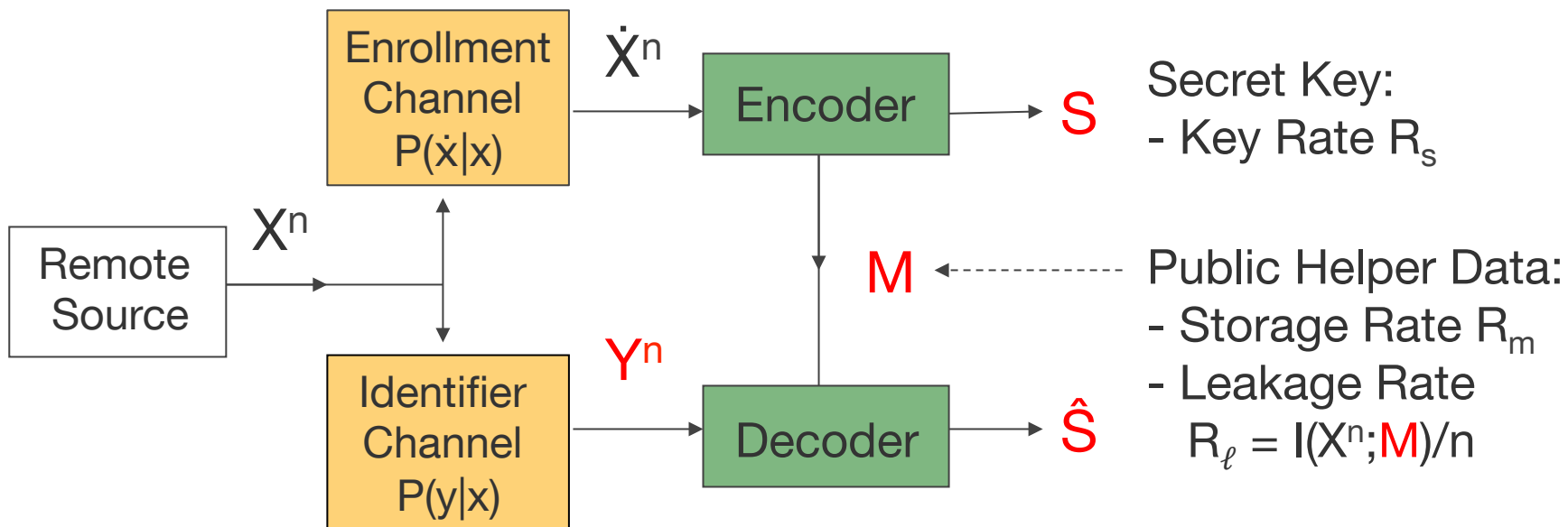
Variations (1)



- Remarks:
 - Commonly studied model* has noiseless enrollment: $\dot{X}=X$
 - Noisy identifier: R_s and R_m stay the same, R_ℓ decreases
 - So why study the noisy model? Two arguments:
The correct model leads to practical insight and is a first step to model **uncertainty** about the source.

* Ignatenko-Willems 2009

Variations (2)



- **Insights:**
 - Multiple-measurements* have \dot{X} and/or Y being vectors and multiple enrollment measurements are useful
 - Finite block-length results can be expected to lead to interesting tradeoffs

* Günlü-Kramer-Skórski 2015; Günlü-Kramer 2016

Security Measures and Capacity

$$\Pr[S \neq \hat{S}] \leq \varepsilon$$

$$I(S;M)/n \leq \varepsilon$$

$$I(X^n;M)/n \leq R_\ell + \varepsilon$$

$$H(S)/n \geq R_s - \varepsilon$$

$$H(M)/n \leq R_m + \varepsilon$$

Remarks:

- ε small and positive
- Reliability
- Secrecy
- Privacy
- Key Rate
- Storage Rate

$$\bigcup \left\{ \begin{array}{l} (R_s, R_\ell, R_m) : 0 \leq R_s \leq I(U; Y) \\ R_\ell \geq I(U; X) - I(U; Y) \\ R_m \geq I(U; \dot{X}) - I(U; Y) \end{array} \right\}$$

where union is over Markov chains $U-\dot{X}-X-Y$

- Remarks:
 - If $\dot{X}=X$ then $R_\ell=R_m$... there are effectively **two** rates
 - Design for general \dot{X} : one “simply” leaks less
 - Design for “wrong” X may violate requirements; a conservative approach designs for \dot{X} (assuming model known)

- Noise-free enrollment: $\dot{X}=X$

$$\bigcup \left\{ \begin{array}{l} (R_s, R_\ell, R_m) : 0 \leq R_s \leq I(U; Y) \\ R_\ell = R_m \geq I(U; X) - I(U; Y) \end{array} \right\}$$

where union is over Markov chains **U-X-Y**

- BSC: $Y = X+Z \text{ mod } 2$, $\Pr[X=1]=0.5$, $\Pr[Z=1]=p$, $0 \leq p < 0.5$
- Problem: maximize $I(\mathbf{U}; \mathbf{Y})$ while minimizing $I(\mathbf{U}; \mathbf{X})$ aka the **information bottleneck problem***
- Solved by using Mrs. Gerber's Lemma** which implies:

$$H(Y|U) \geq h\left(p * h^{-1}\left(H(X|U)\right)\right)$$

with equality if the **U**-to-X channel is a BSC with crossover probability $h^{-1}(H(X|U))$... here $p * q$ denotes “cyclic convolution”

* Witsenhausen-Wyner 1975; Tishby-Pereira-Bialek 1999; ** Wyner-Ziv 1973

- Given U , let $q = h^{-1}(H(X|U))$. Mrs. Gerber's Lemma implies:

$$H(Y|U) \geq h(p * q)$$

- Proof steps:

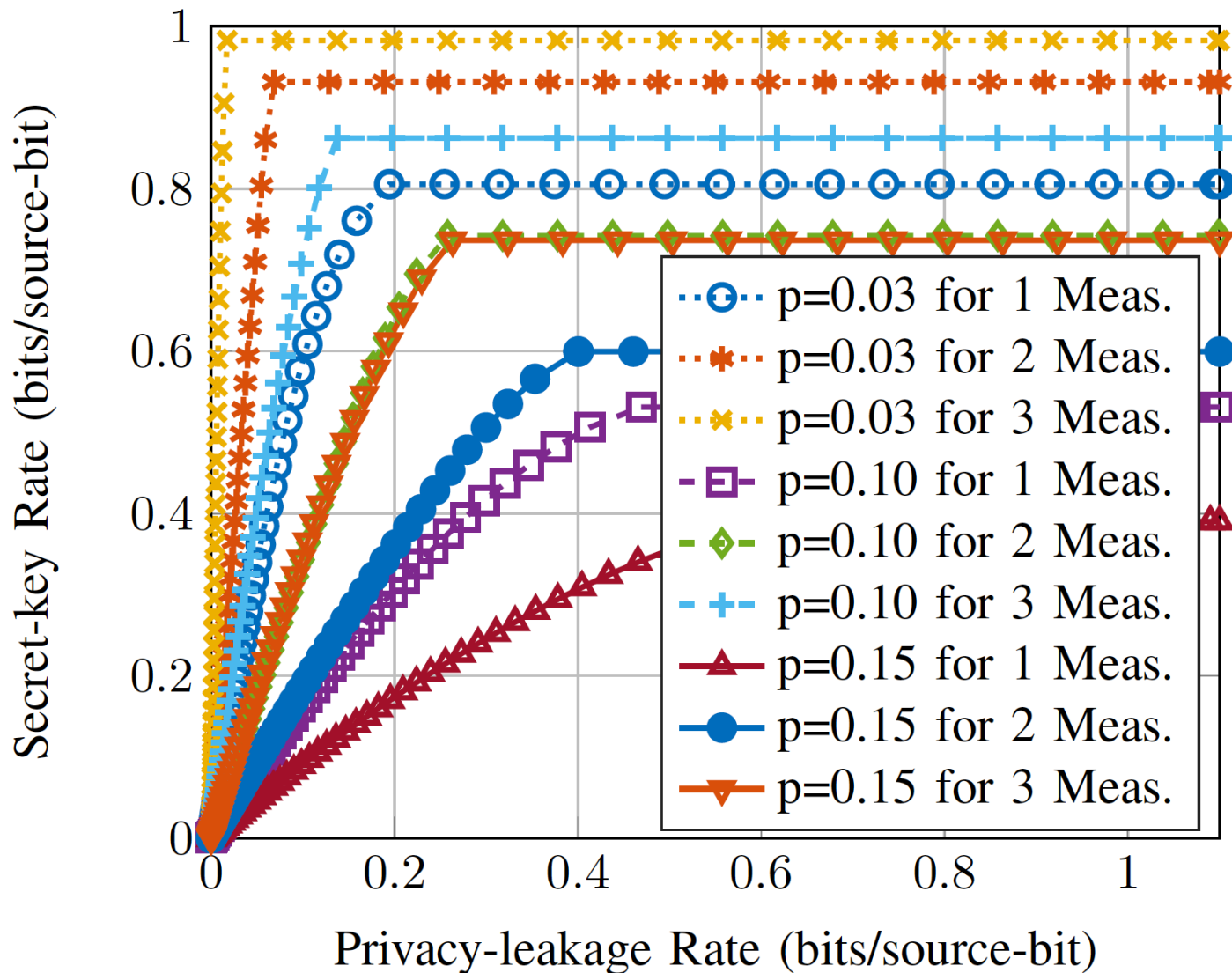
$$I(U; Y) = H(Y) - H(Y|U) \leq H(Y) - h(p * q)$$

$$\begin{aligned} I(U; X) - I(U; Y) &= H(X) - H(Y) + H(Y|U) - H(X|U) \\ &\geq H(X) - H(Y) + h(p * q) - H(X|U) \end{aligned}$$

- So a BSC from U -to- X is best: must optimize **one** number only
- Results extend (with a few limitations) to multiple measurements during enrollment and identification*

* Günlü-Kramer-Skórski 2015; Günlü-Kramer 2016

Example: BSCs and Multiple Measurements*



- R_s vs. $R_\ell=R_m$
- Biometrics: low leakage R_ℓ
- PUFs: large key rate R_s and (then) minimal leakage rate R_ℓ

* Günlü-Kramer-Skórski 2015

Biometric and Device Security

- use unique variations to authenticate and produce keys
- measurement process is noisy: use error control codes
- three parameters: security, privacy, storage

For more information about PUFs, see

- “Physical Unclonable Functions and Applications: A Tutorial”, Proc. IEEE, vol. 102, no. 8, 2014