

# Receiver-side Opportunism in Cognitive Networks

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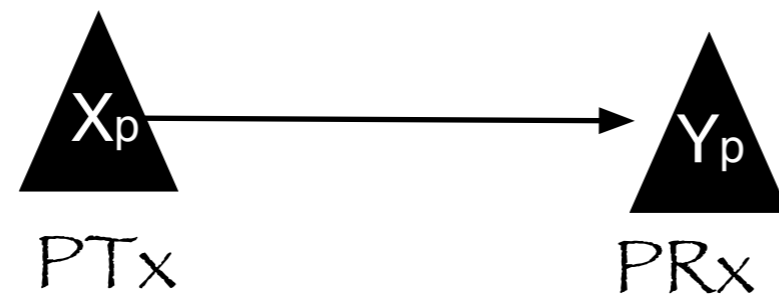
Natasha Devroye, University of Illinois at Chicago

Petar Popovski, Aalborg University



# Secondary spectrum licensing

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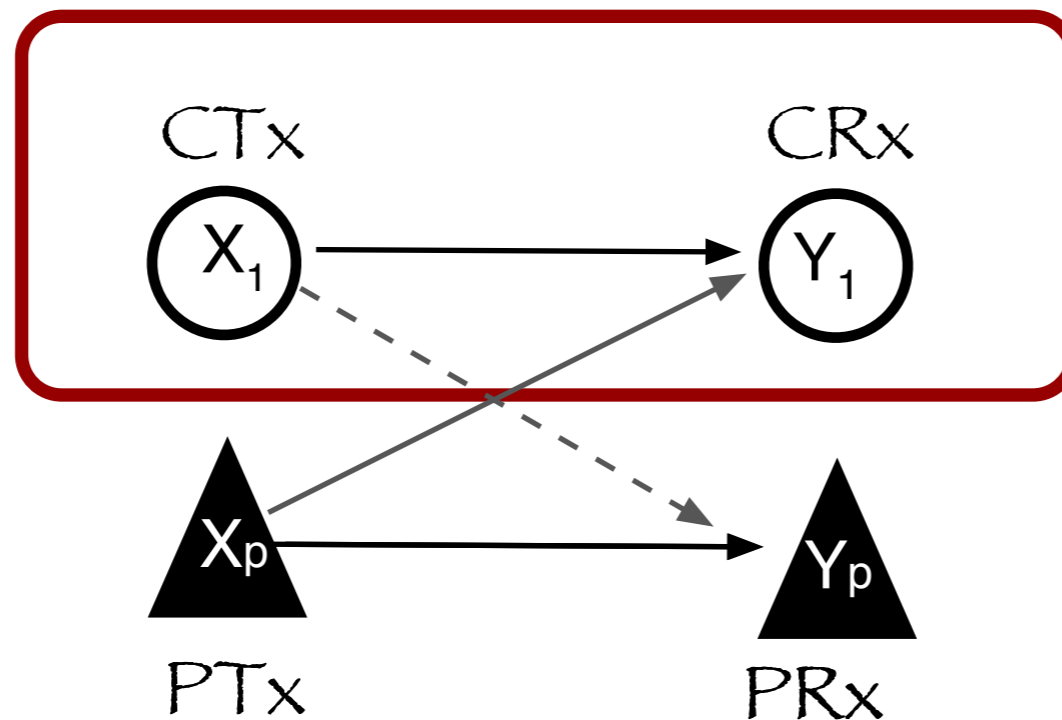


Primary users

# Secondary spectrum licensing

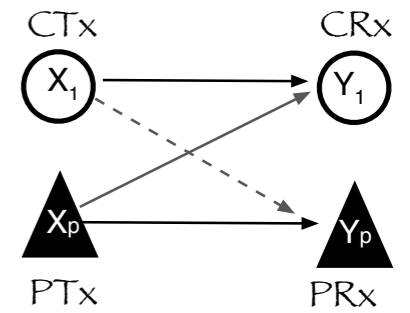
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Secondary users  $\leftrightarrow$  Cognitive radios

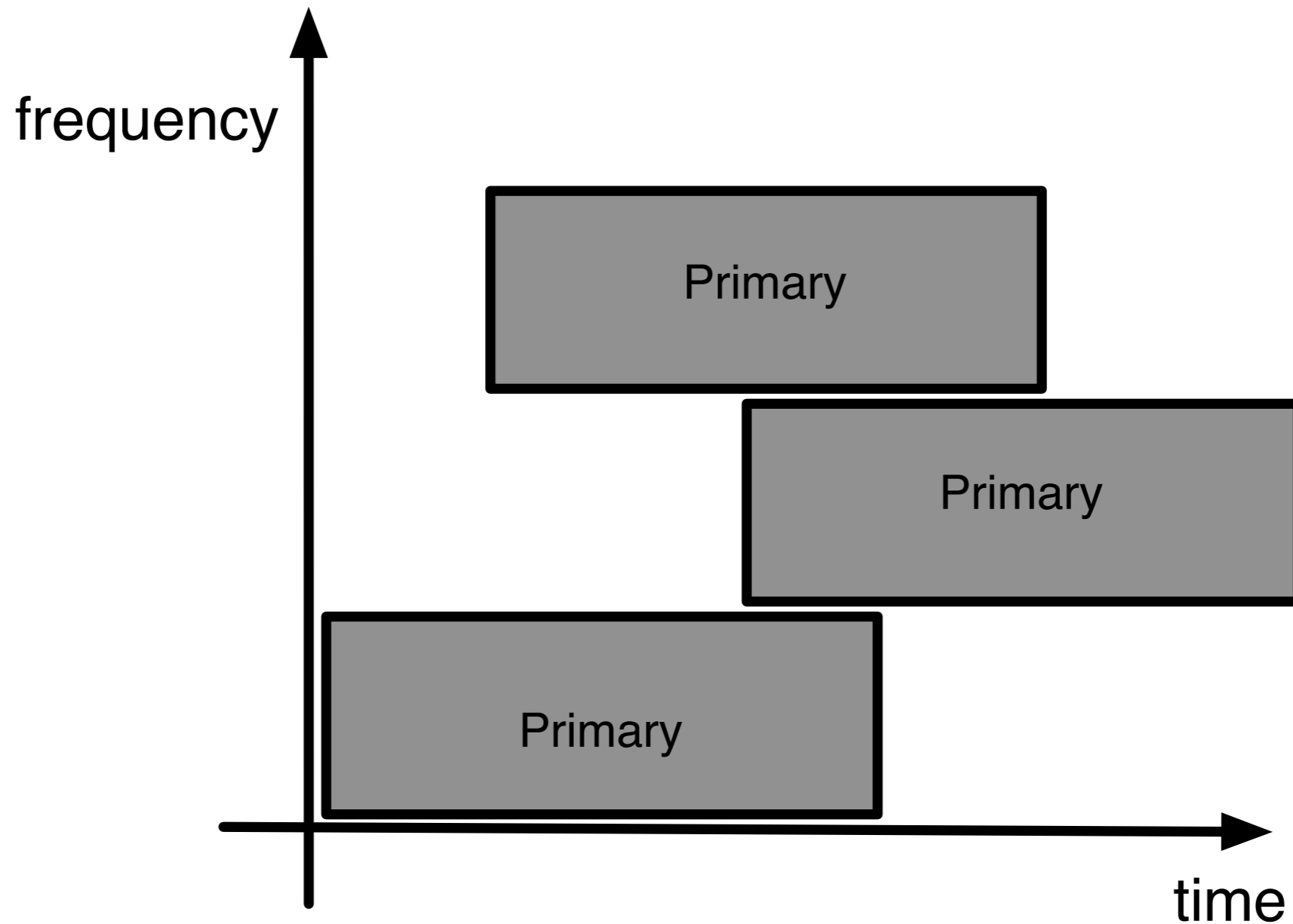


Primary users

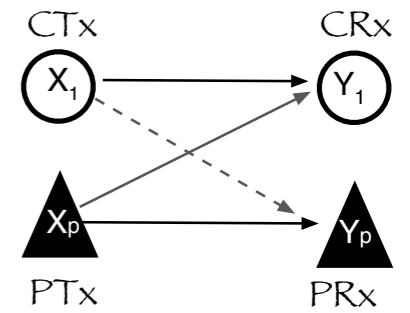
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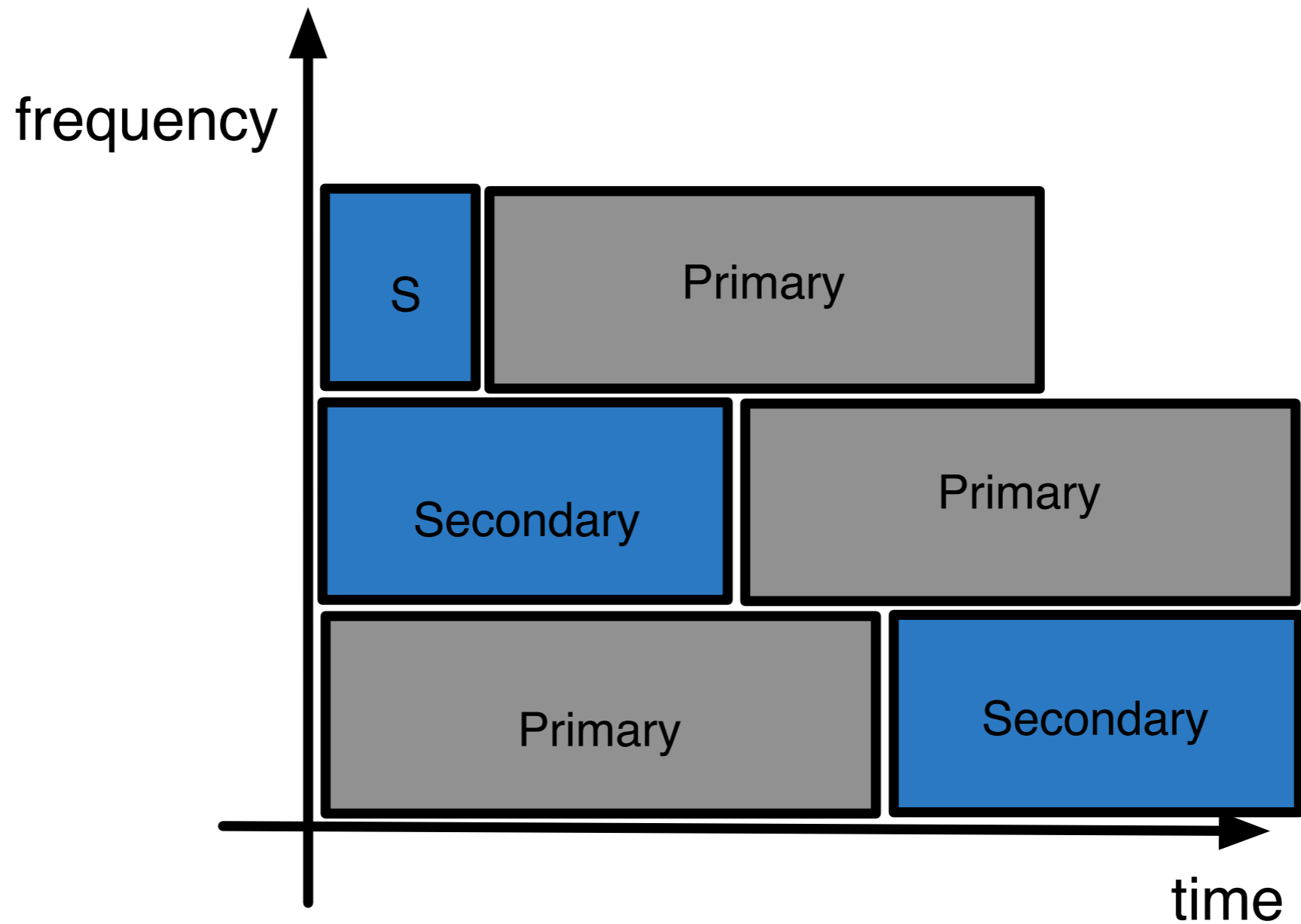
## 1. White-space filling



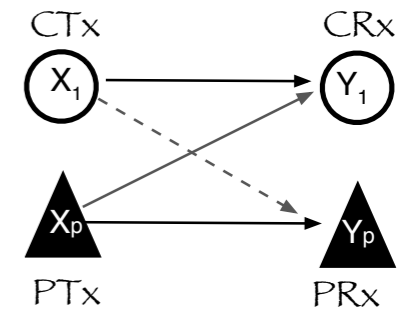
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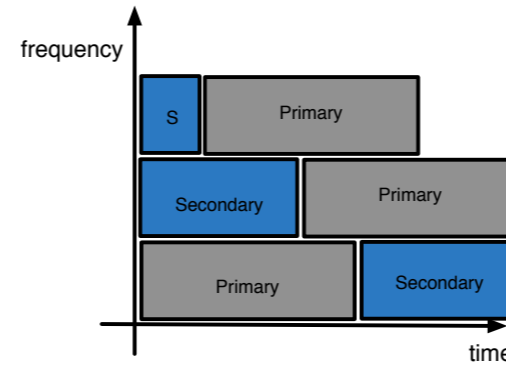
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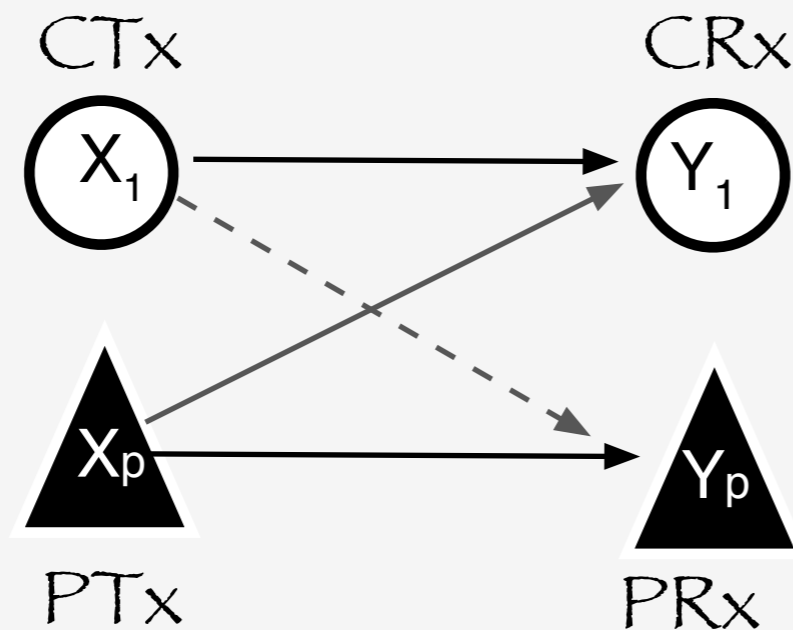
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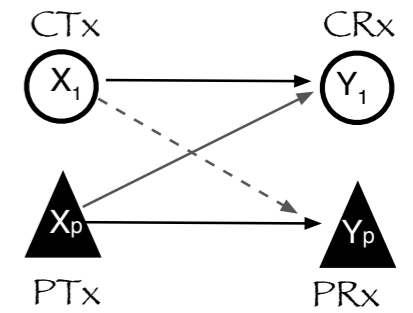
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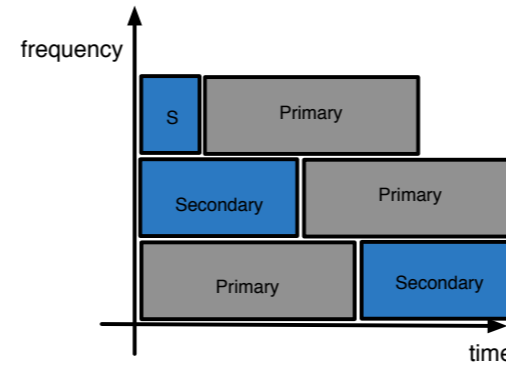
## 2. Underlay / interference-temperature



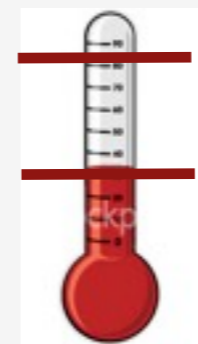
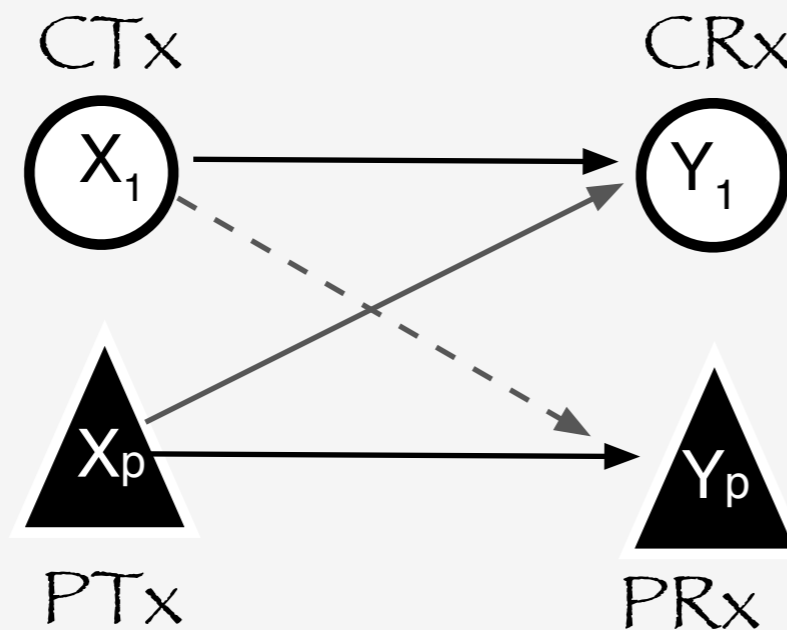
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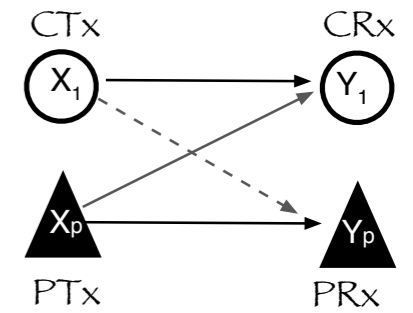
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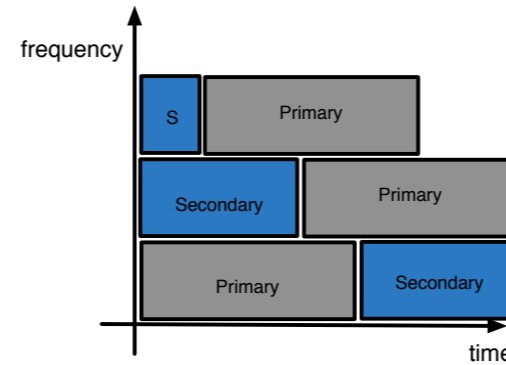
Maximal interference

Current interference

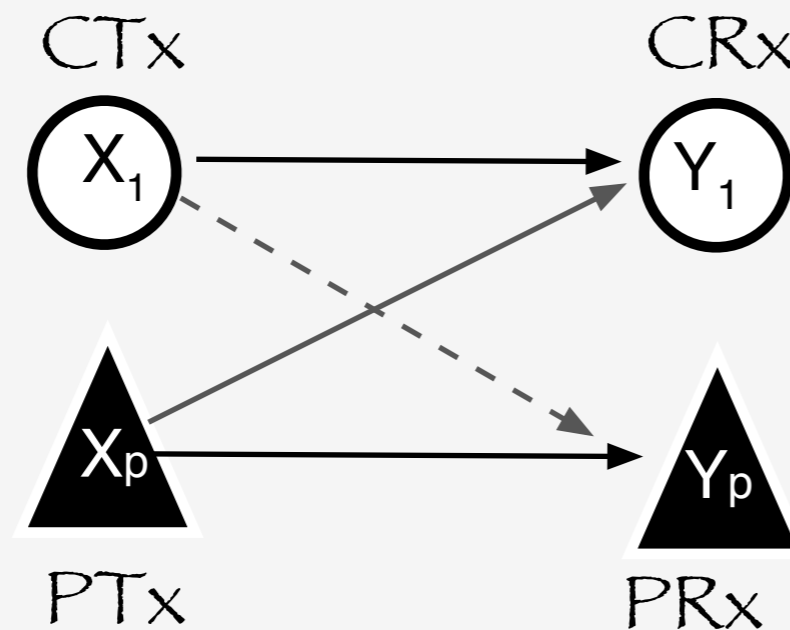
# Secondary licensing



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## 2. Underlay / interference-temperature



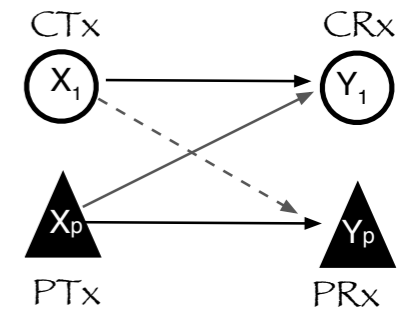
Maximal interference

CTx can add!

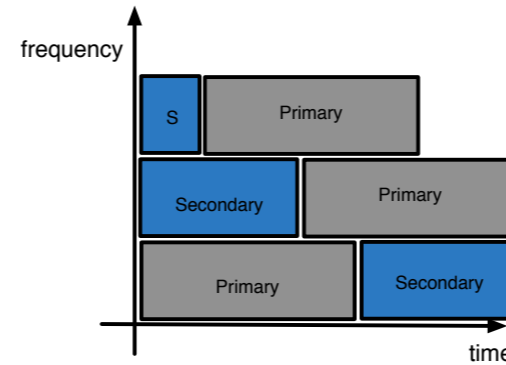
Current interference



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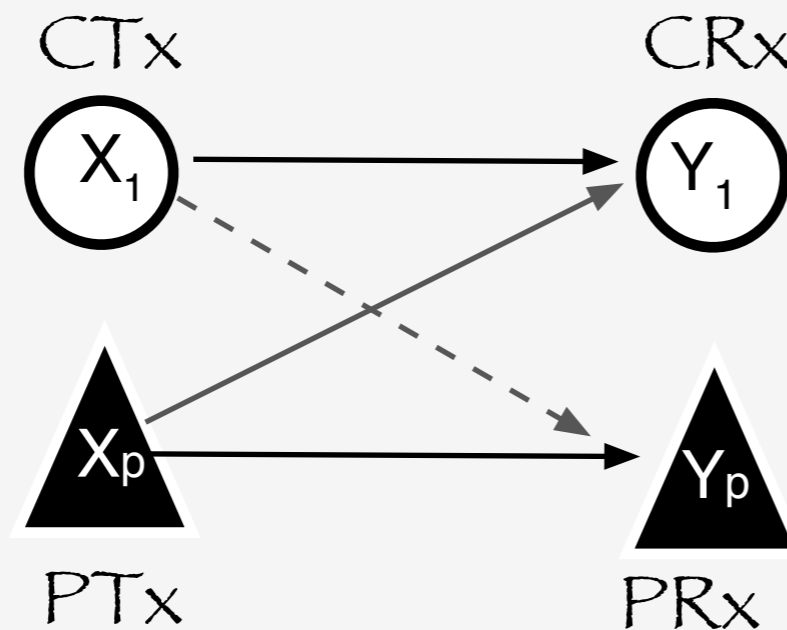


## 1. White-space filling



## 2. Underlay / interference-temperature

Determines  
power level

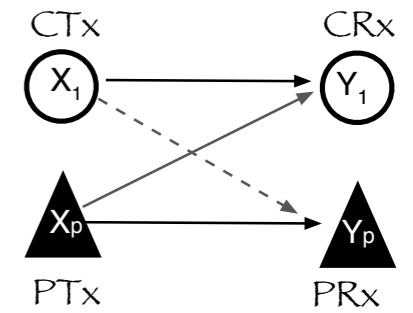


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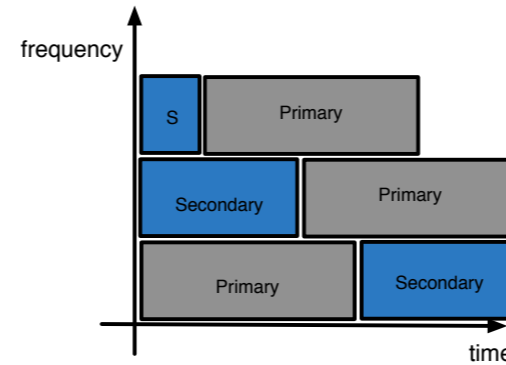
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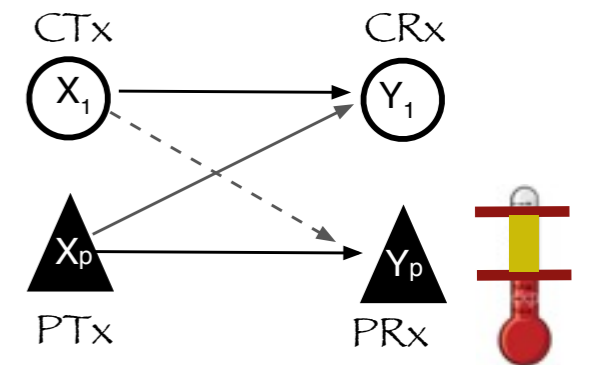
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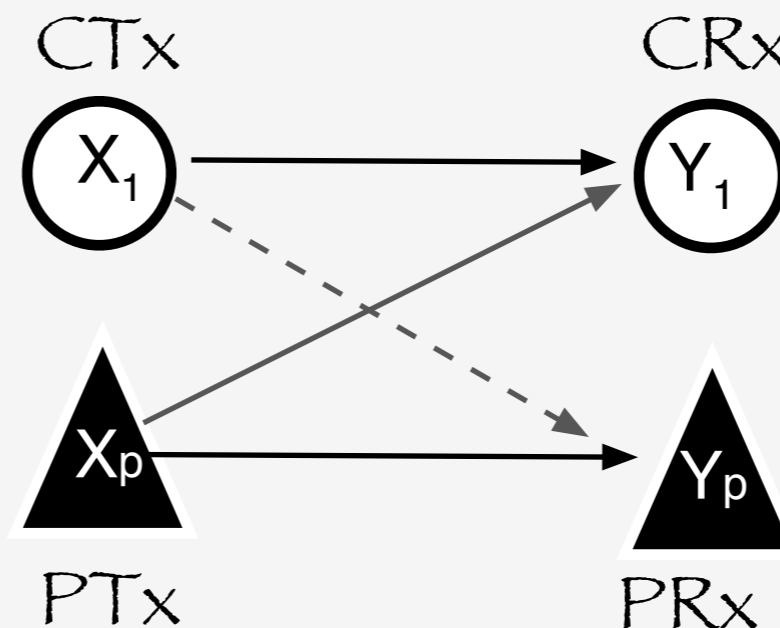
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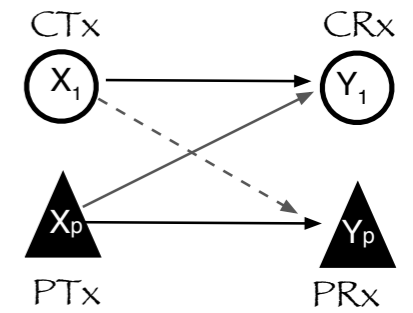


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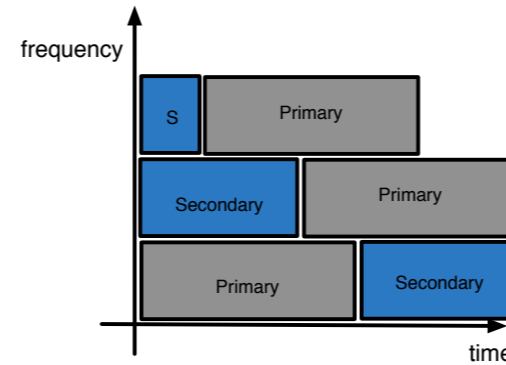


Control  
interference

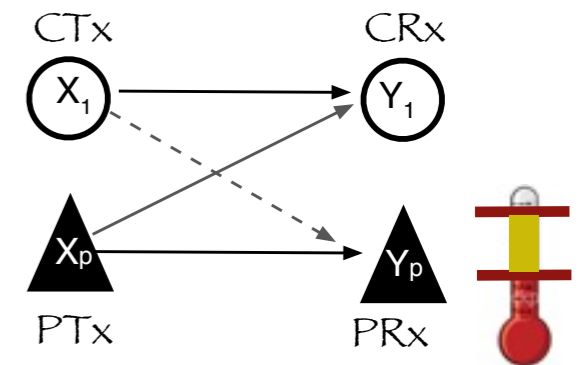
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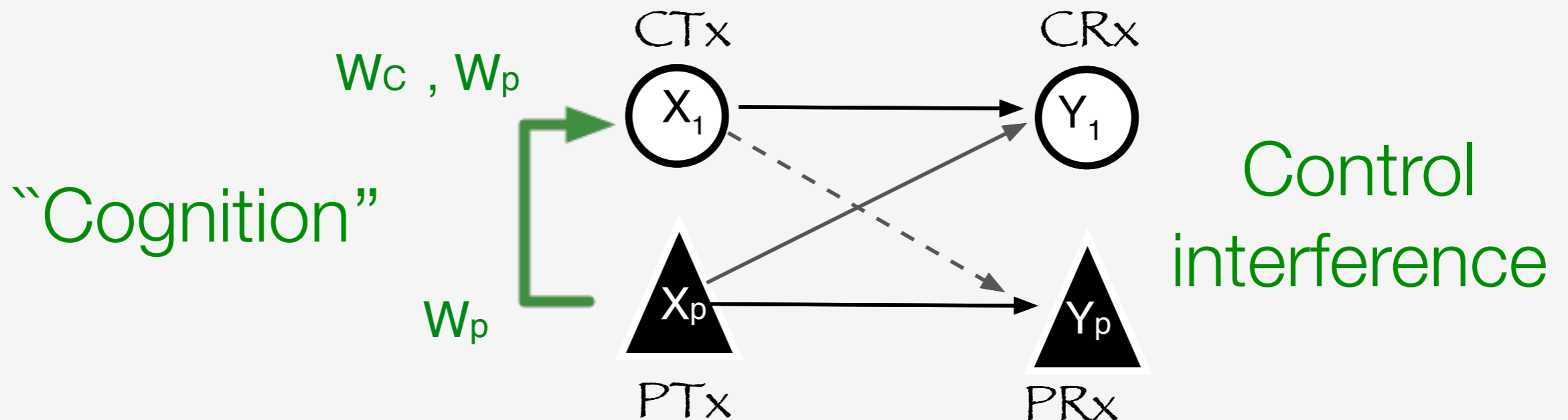
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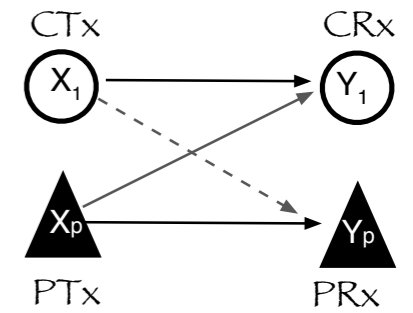


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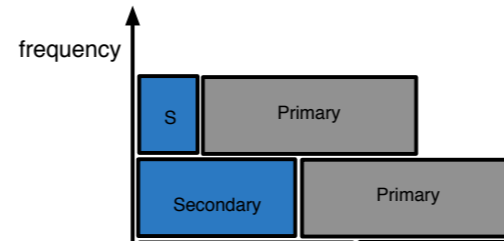


Emphasis on cognitive Tx, CTx!

# Cognitive Tx?

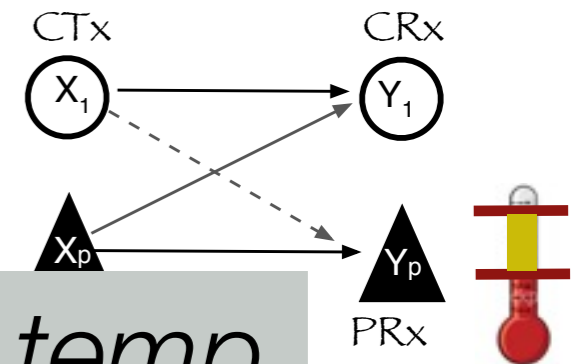


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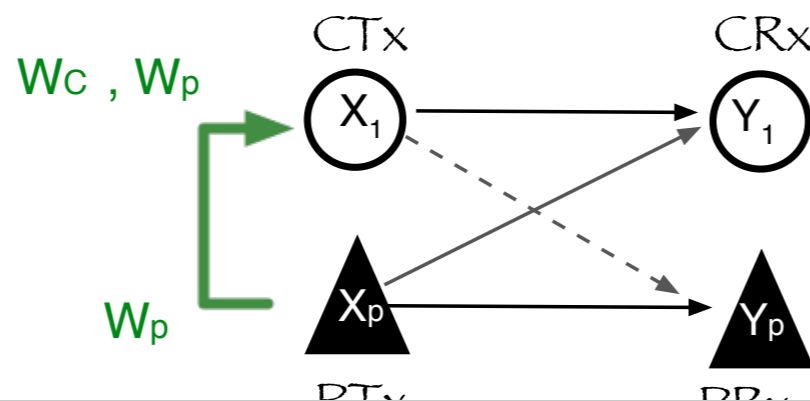
*CTx senses spectral gaps + fills them*

## 2. Underlay / interference-temperature



*CTx adjusts power to interference temp.*

## 3. Overlay



*CTx controls interference*

What about intelligent CR<sub>x</sub> behavior?

What about intelligent CR<sub>x</sub> behavior?

**O**ppportunistic **I**nterference **C**ancelation!

**OIC**

# Outline

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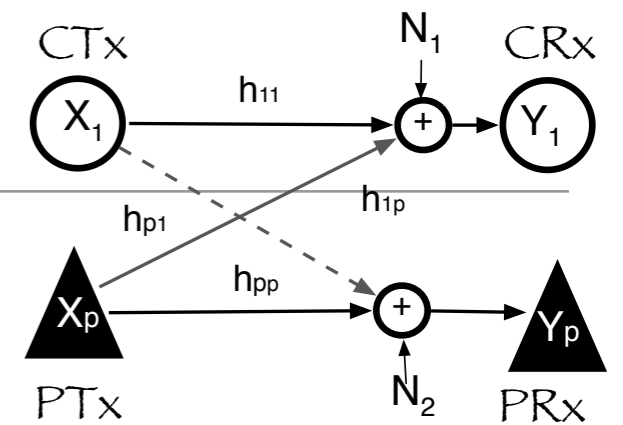
- Past work: plain point-to-point cognitive channel with OIC
- This work: Multiple access channel with OIC
- This work: Interference channel with OIC
- This work: Broadcast channel with OIC



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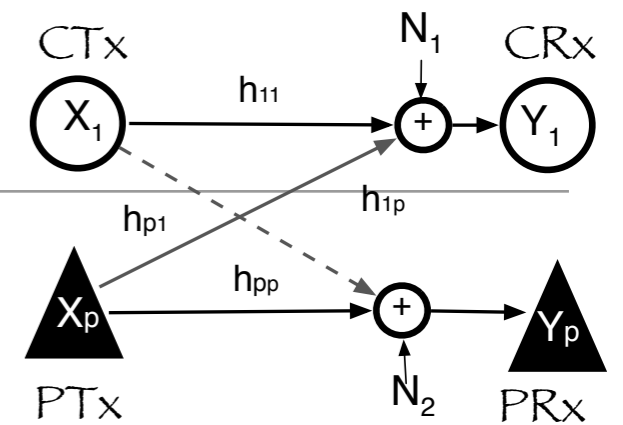
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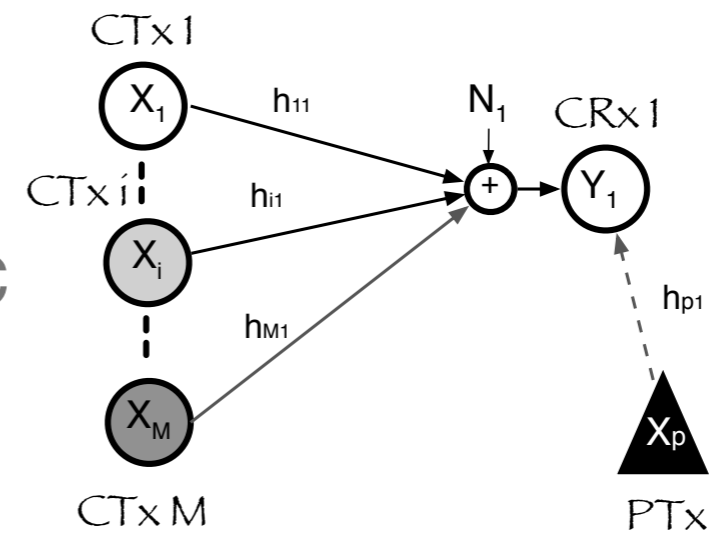
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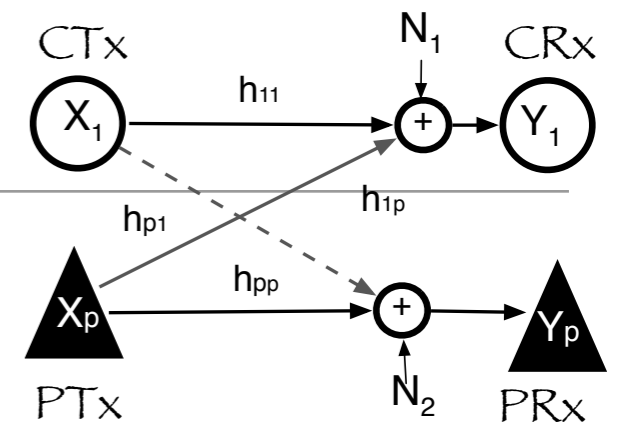


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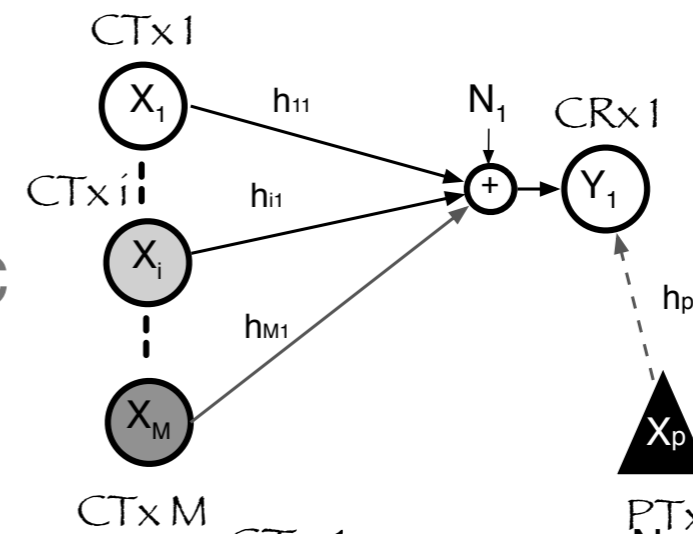
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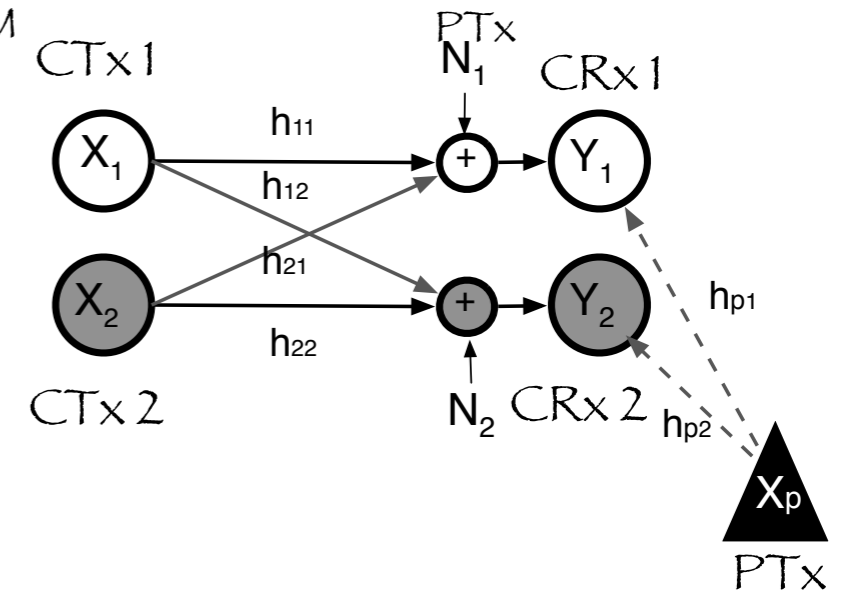
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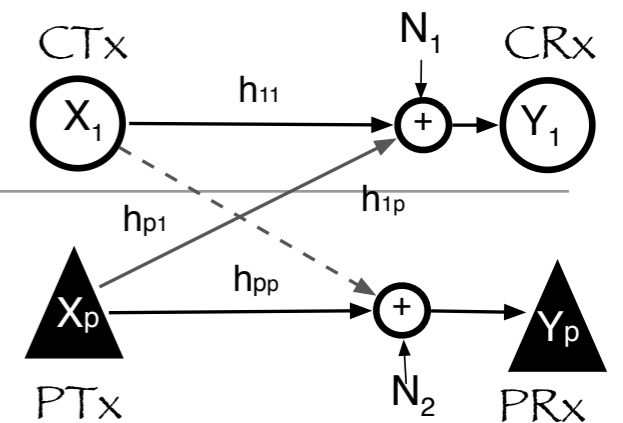
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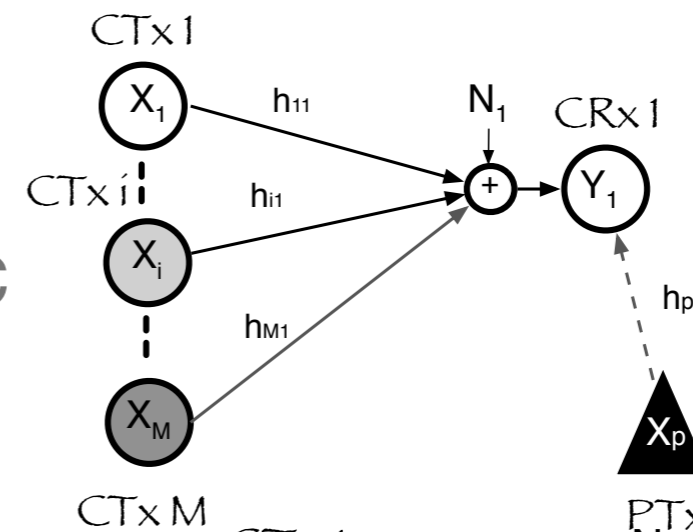
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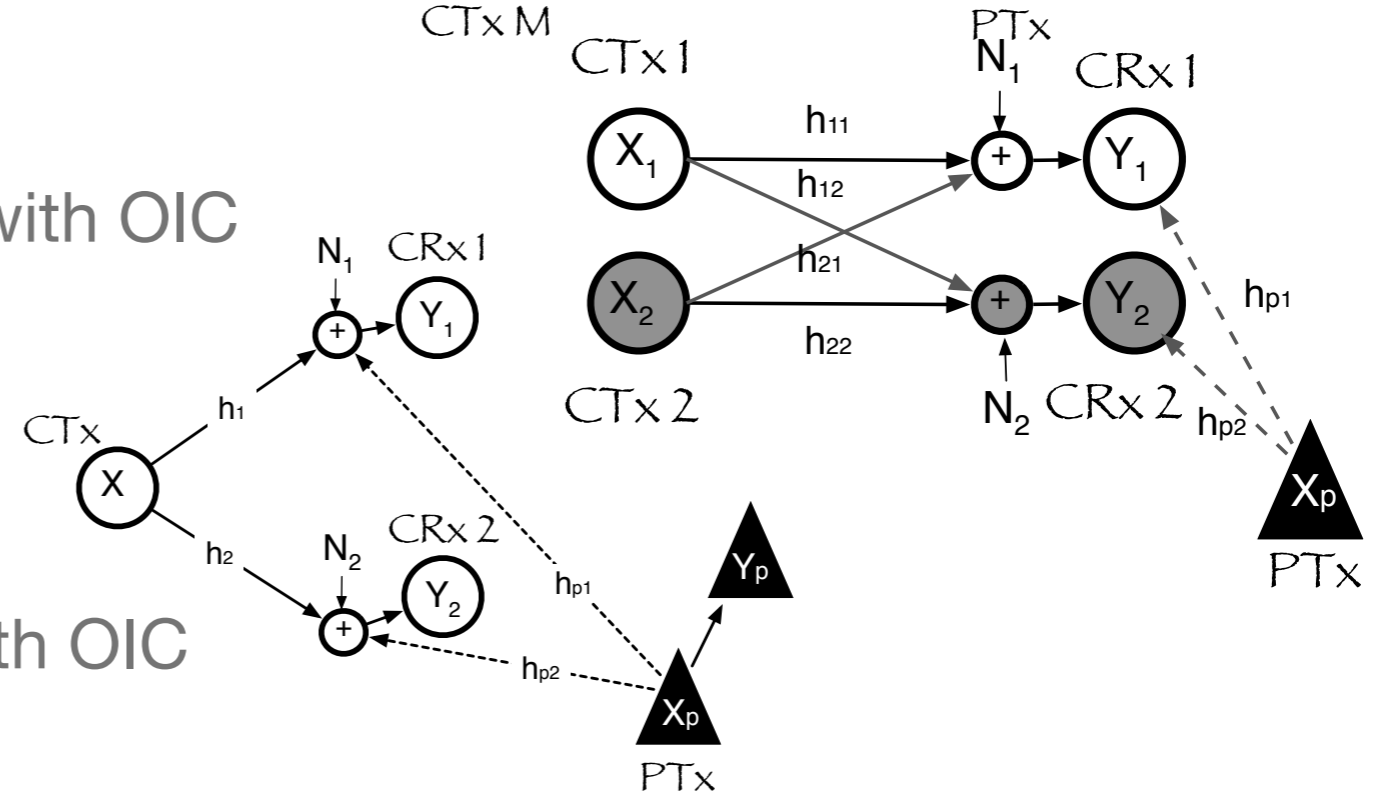
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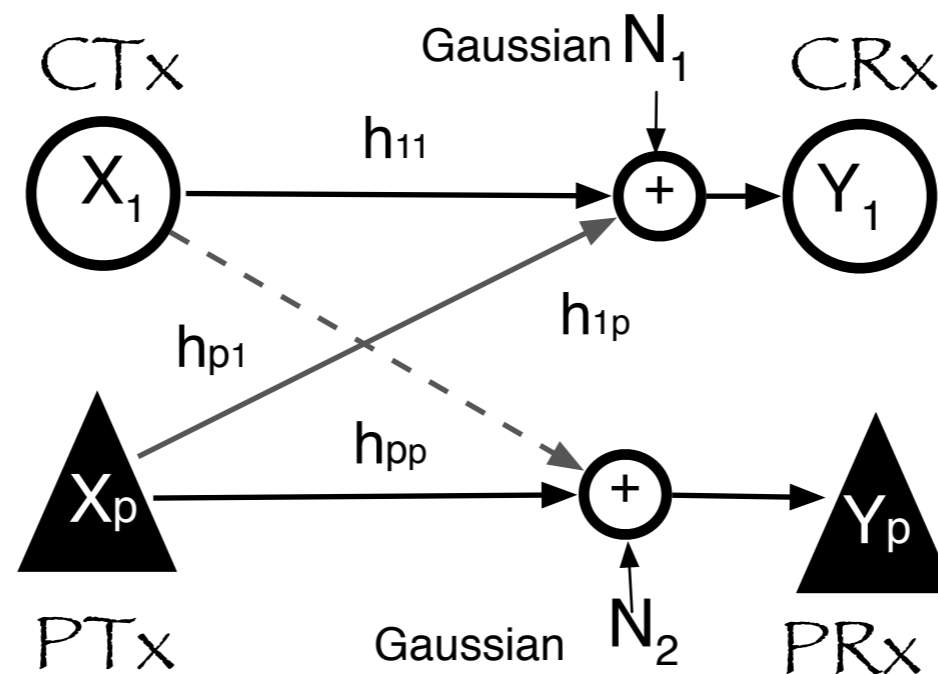
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- This work: Broadcast channel with OIC

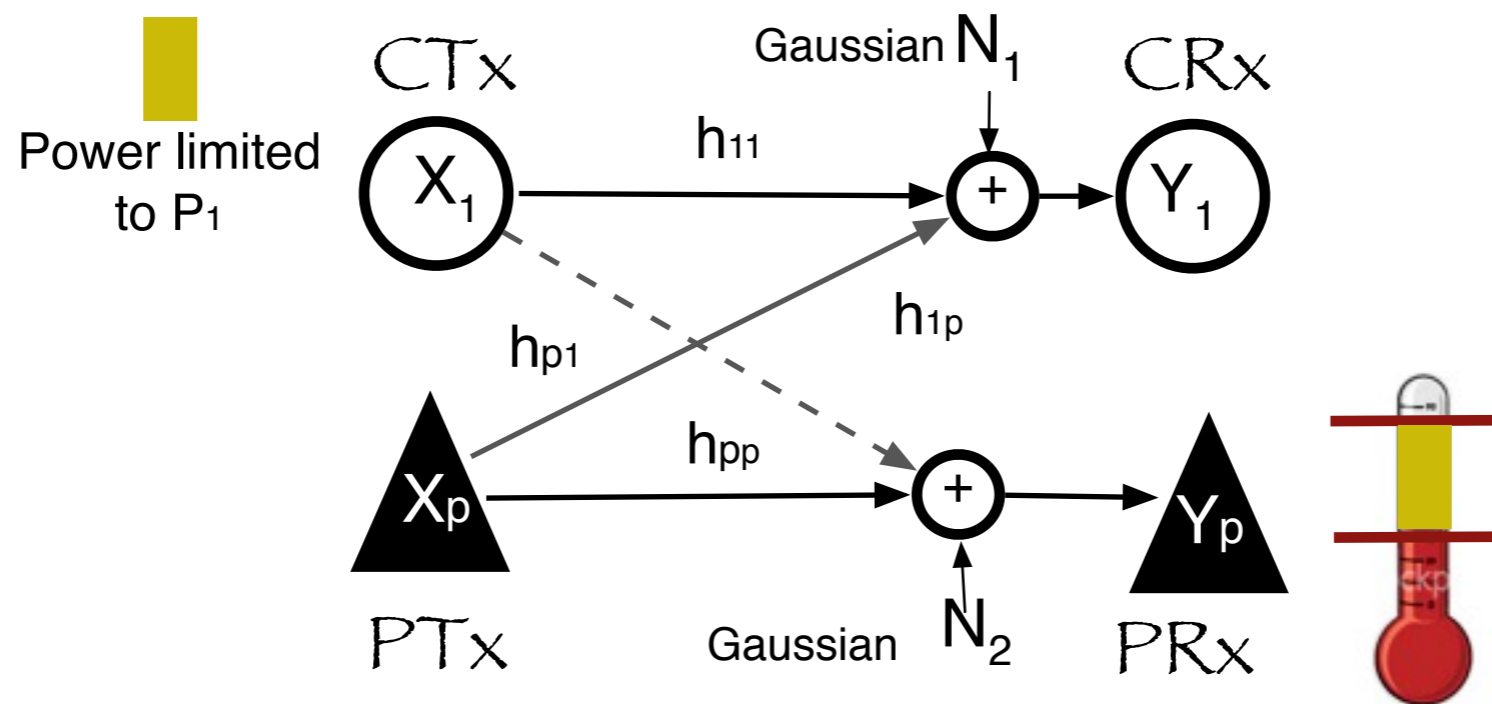
# Opportunistic Interference Cancellation (OIC)

- introduced by Popovski et al. [*P. Popovski, H. Yomo, K. Nishimori, R. D. Taranto, and R. Prasad, DYSpan 2007*]



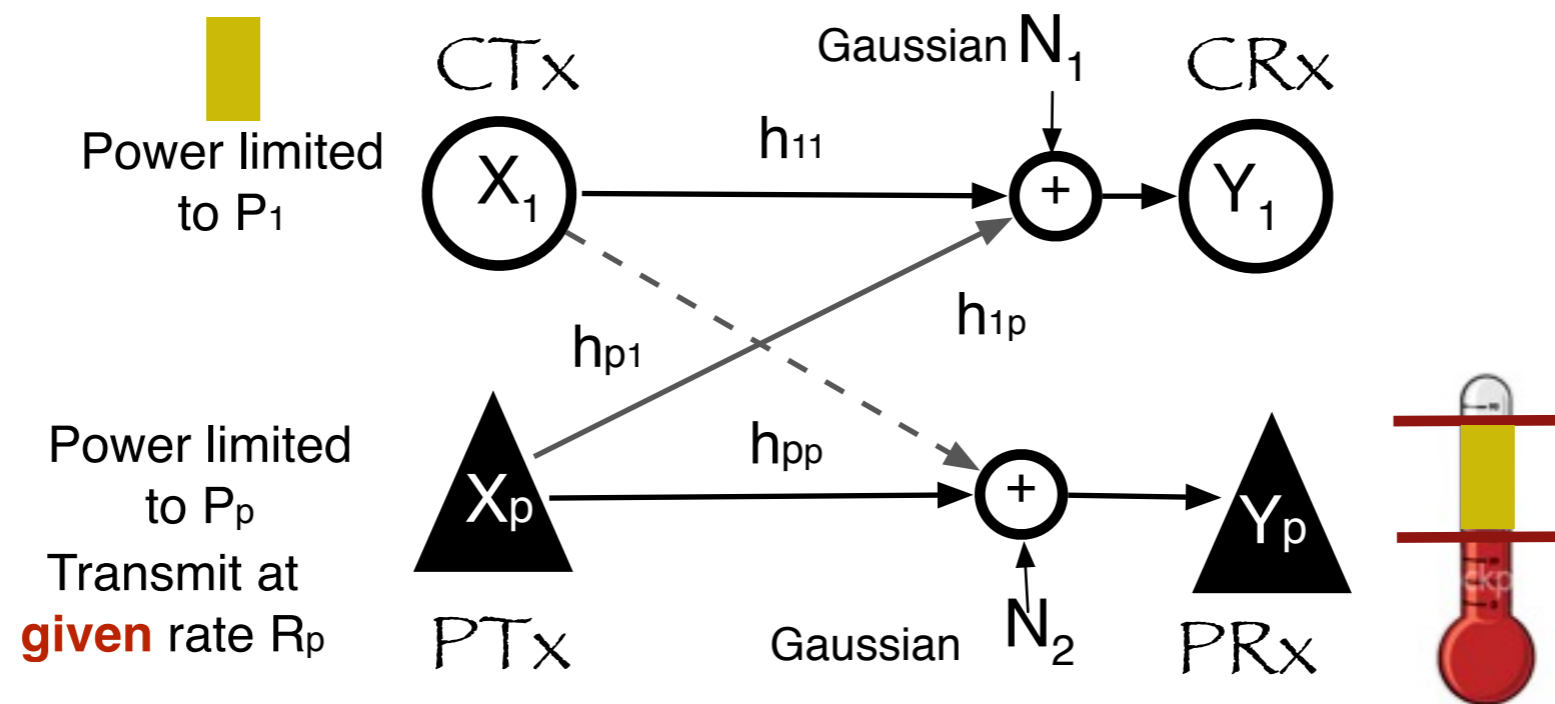
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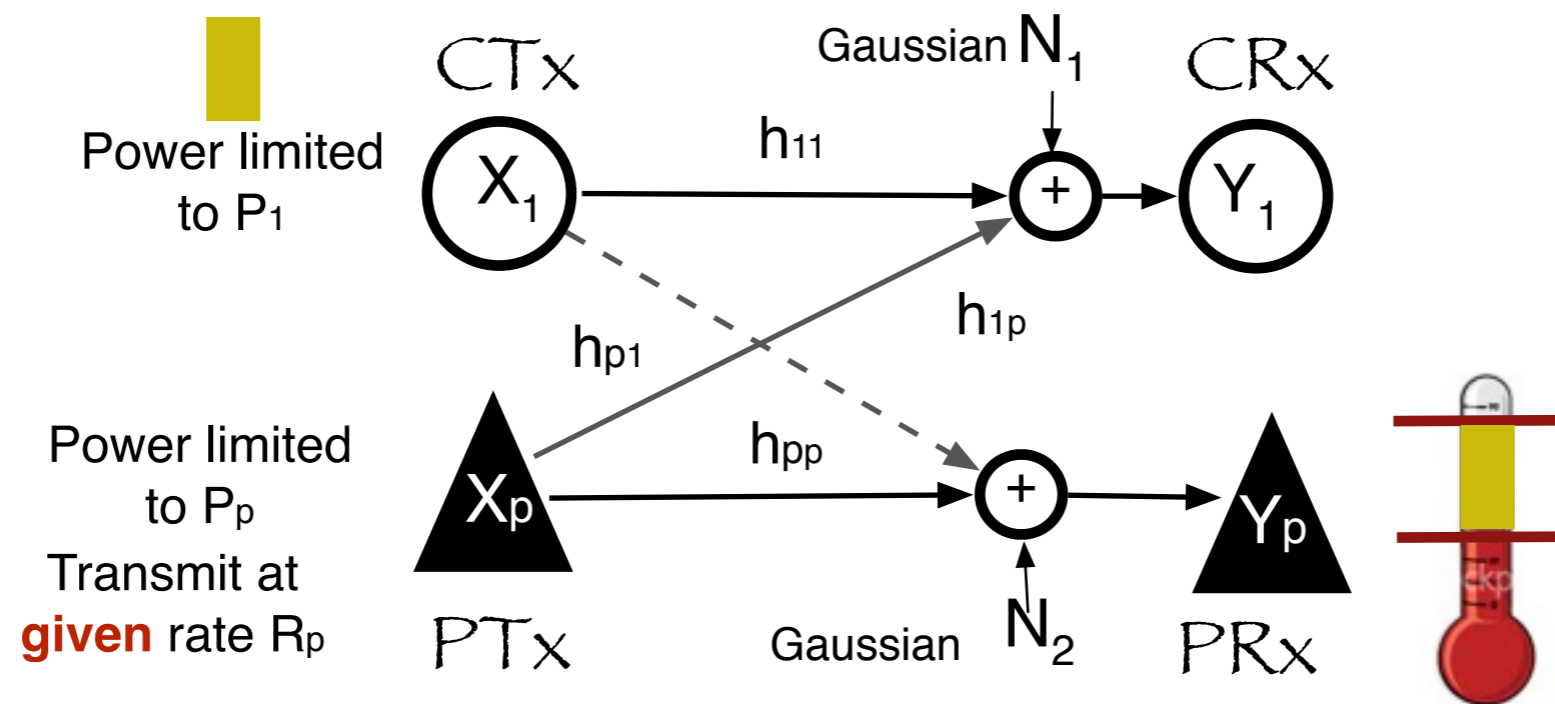
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$$P_1^* \leq \min\{I_0/|h_{p1}|^2, P_1\}$$

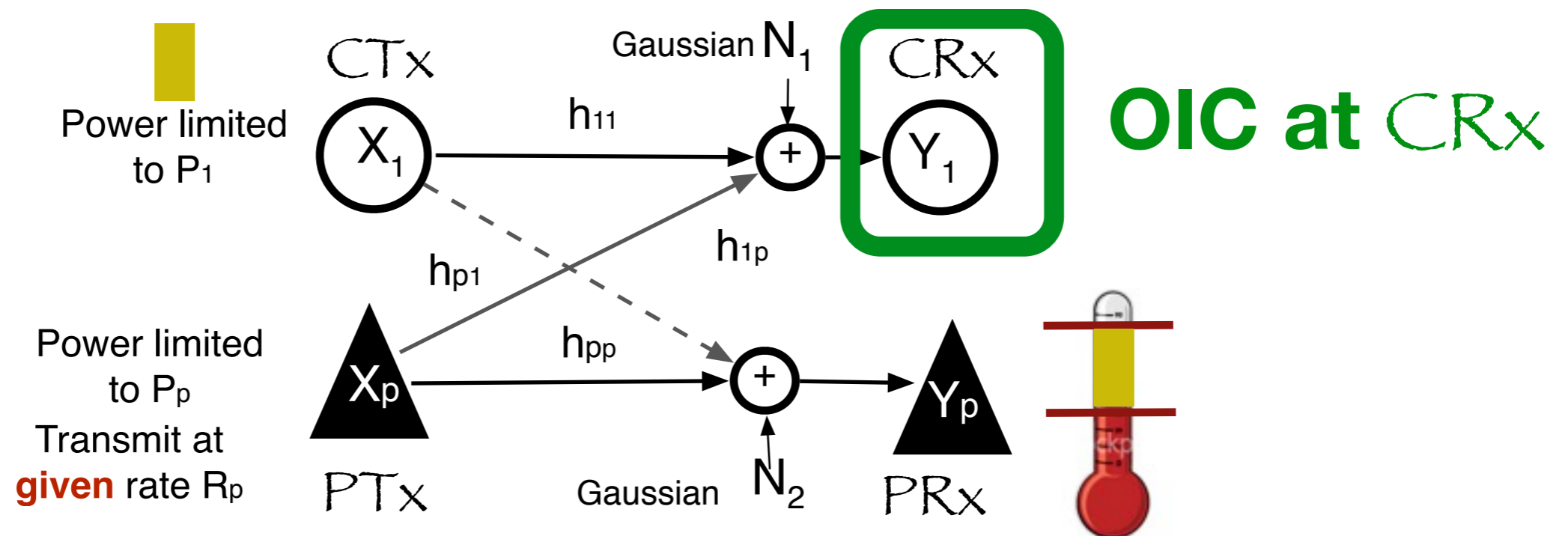




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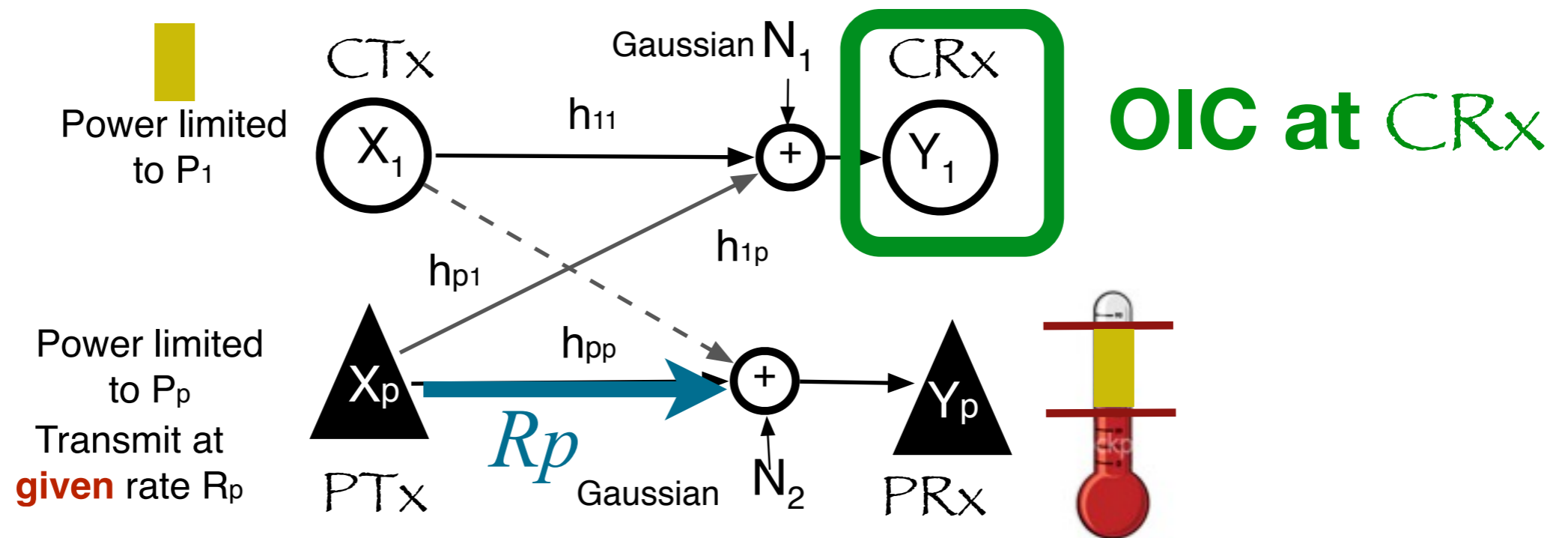
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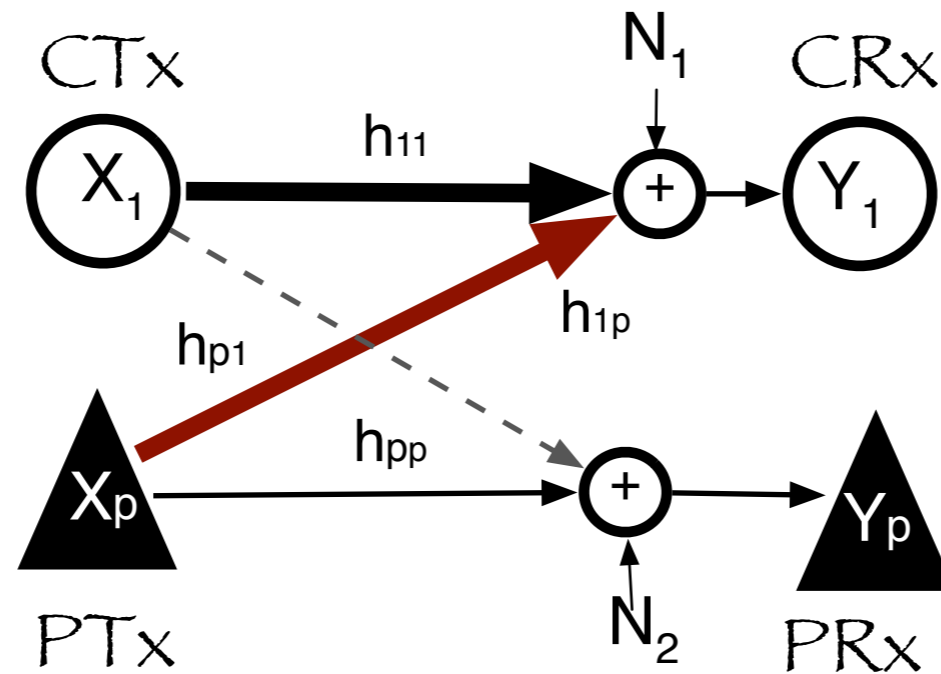
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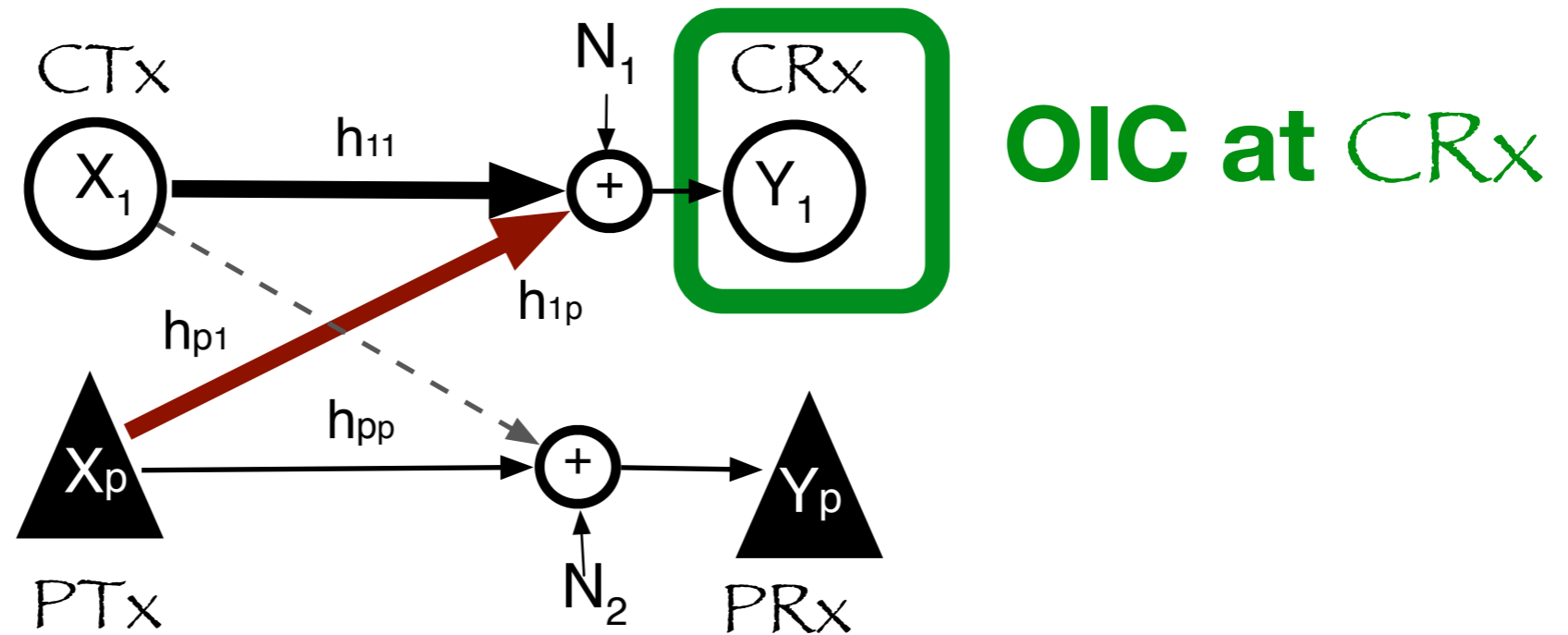
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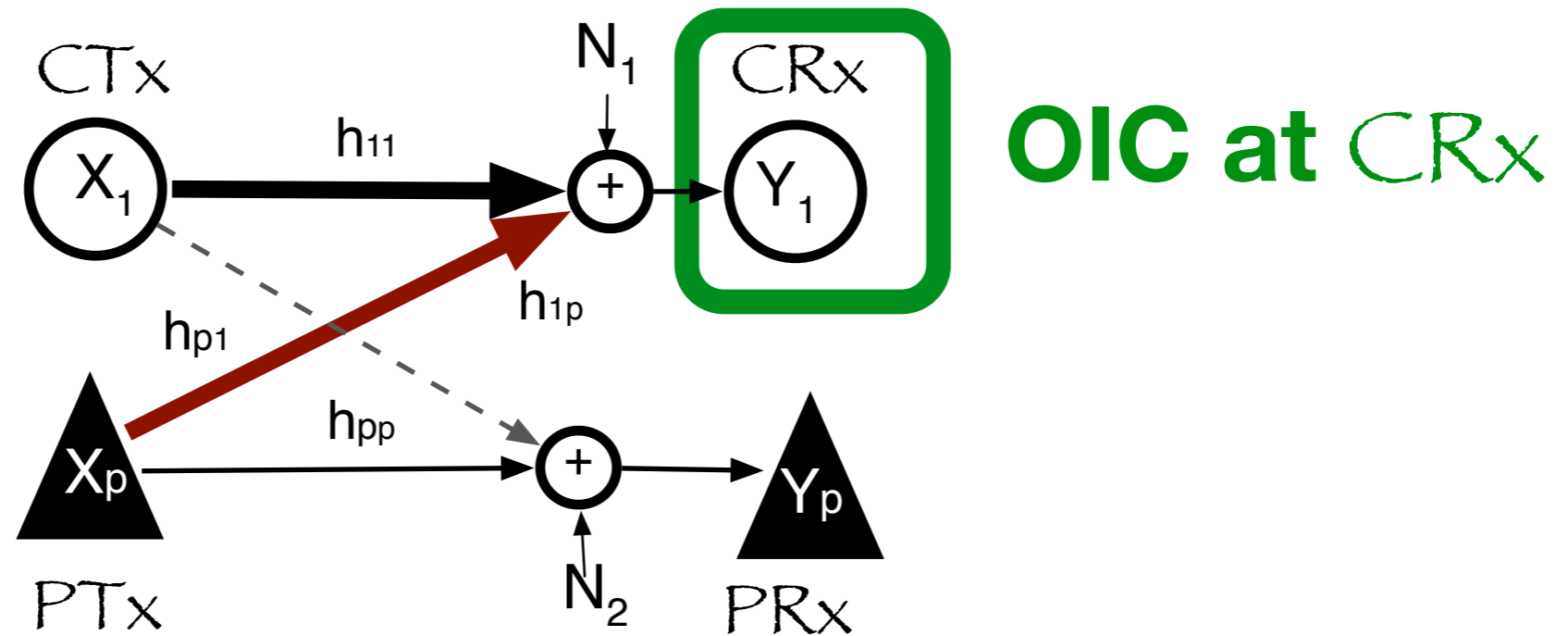
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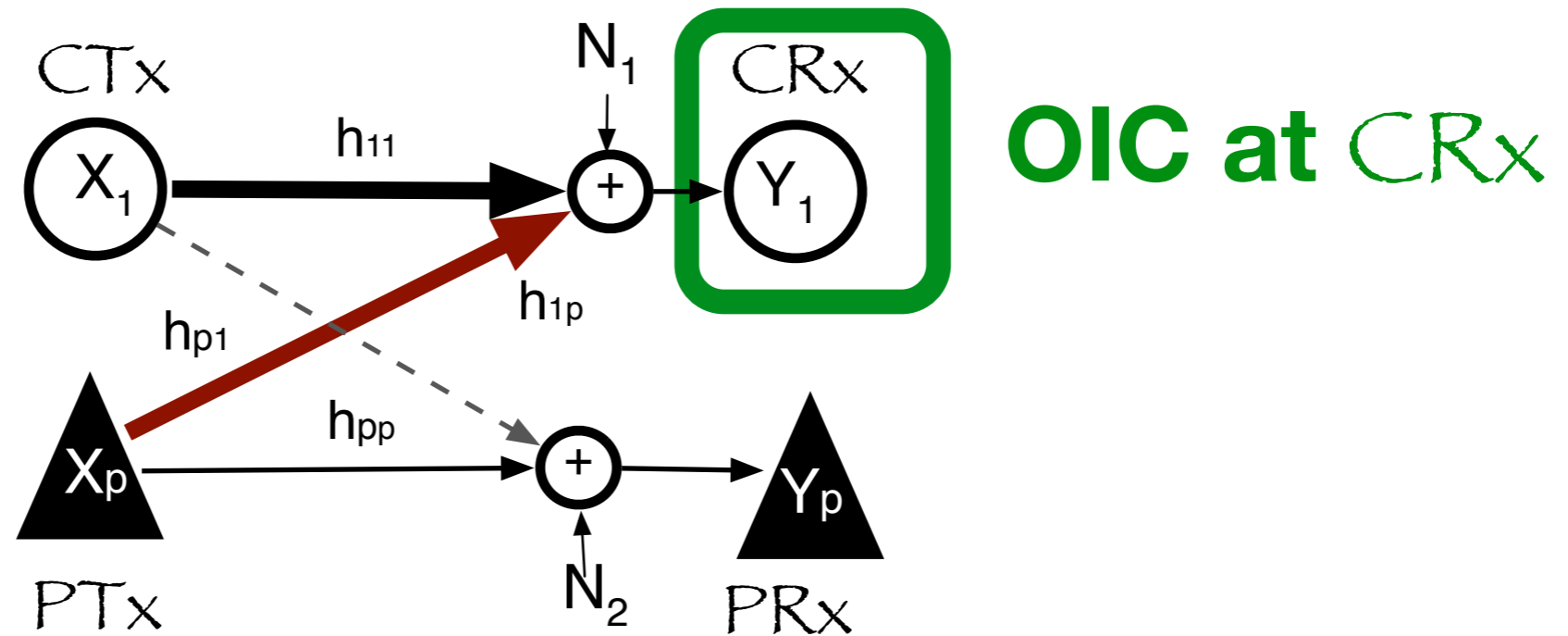
# Opportunistic Interference Cancellation (OIC)



## KEY ASSUMPTION:

CR<sub>x</sub> has codebook of  $(PT_x, PR_x)$

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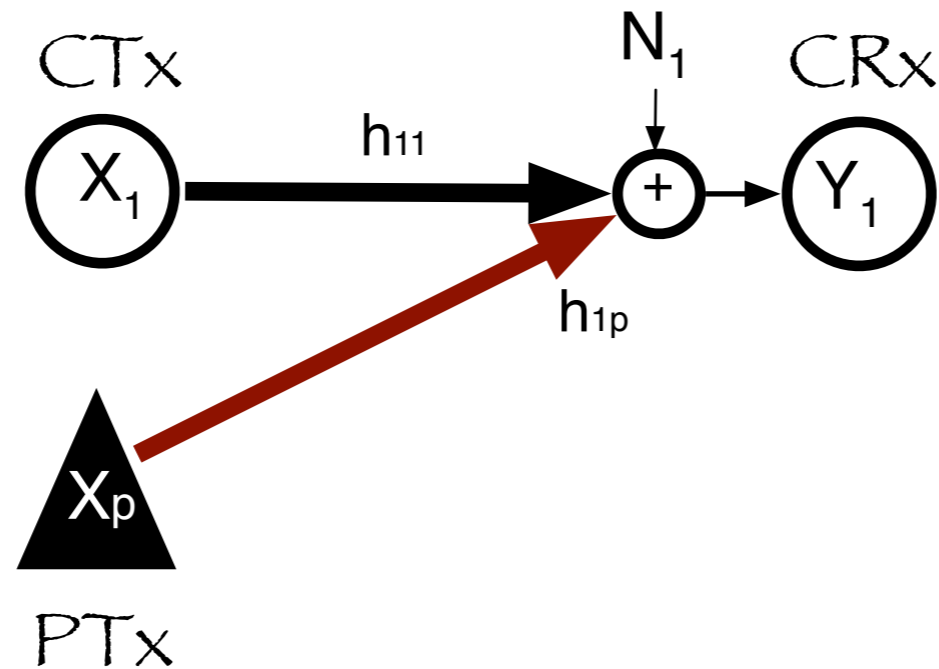
uses this to decode

“opportunistically”

Decode PTx message “**opportunisticly**”?

# “Opportunistically:”

---



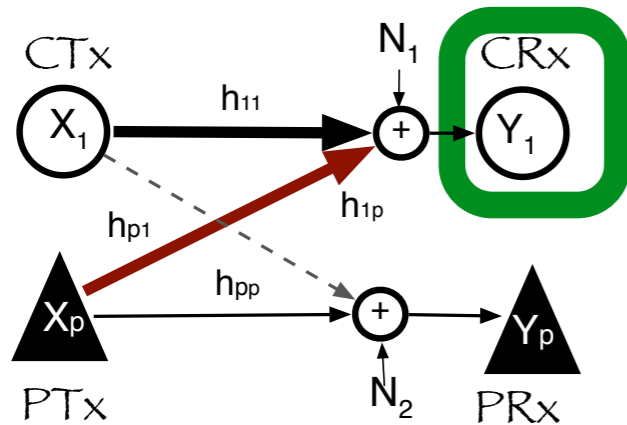
Constraint 1:  $R_p^*$  fixed by primary

Constraint 2: primary SNR at CRx depends on channel gain

$$\gamma_{p1} := |h_{1p}|^2 P_p$$



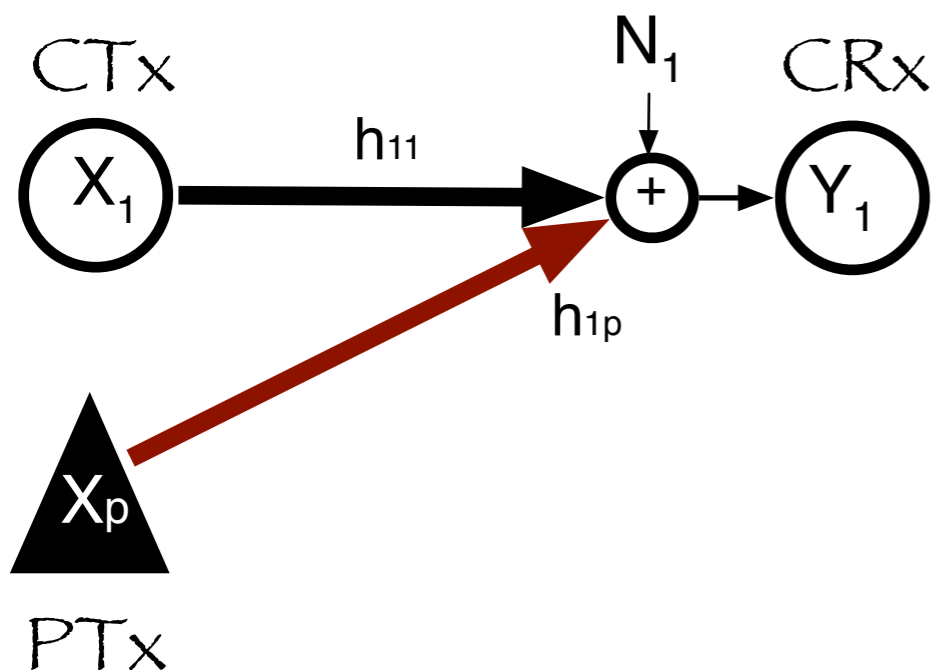
# “Opportunistically:”



$$Y_1 = h_{11}X_1 + h_{p1}X_p + N_1$$



Multiple Access Channel, know capacity!

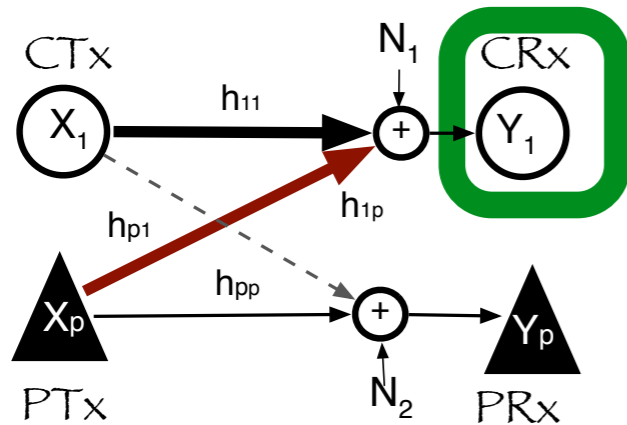


$$R_c \leq I(X_1; Y_1 | X_p)$$

$$R_p \leq I(X_p; Y_1 | X_1)$$

$$R_c + R_p \leq I(X_1, X_p; Y_1)$$

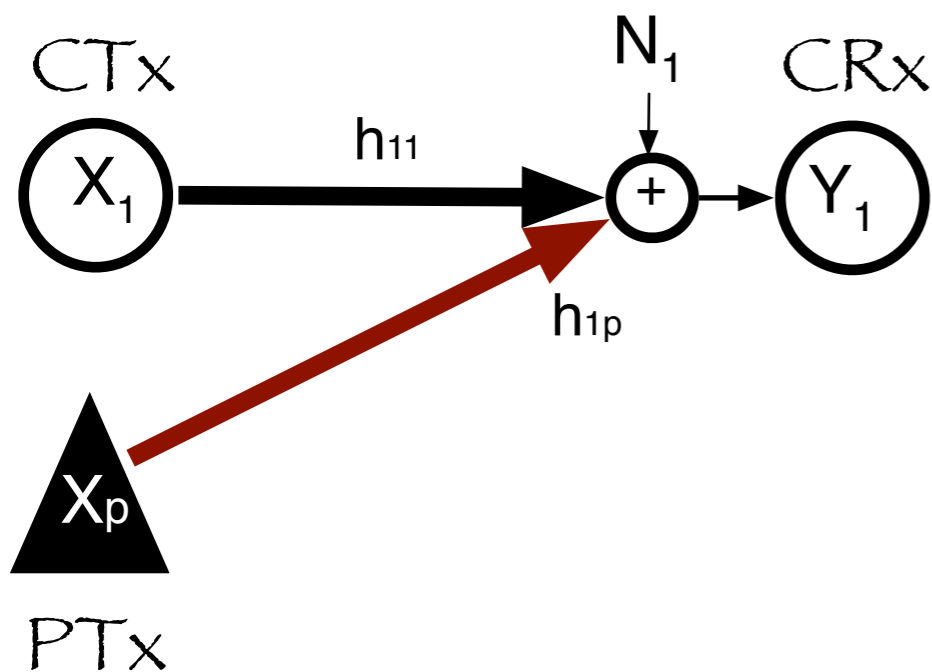
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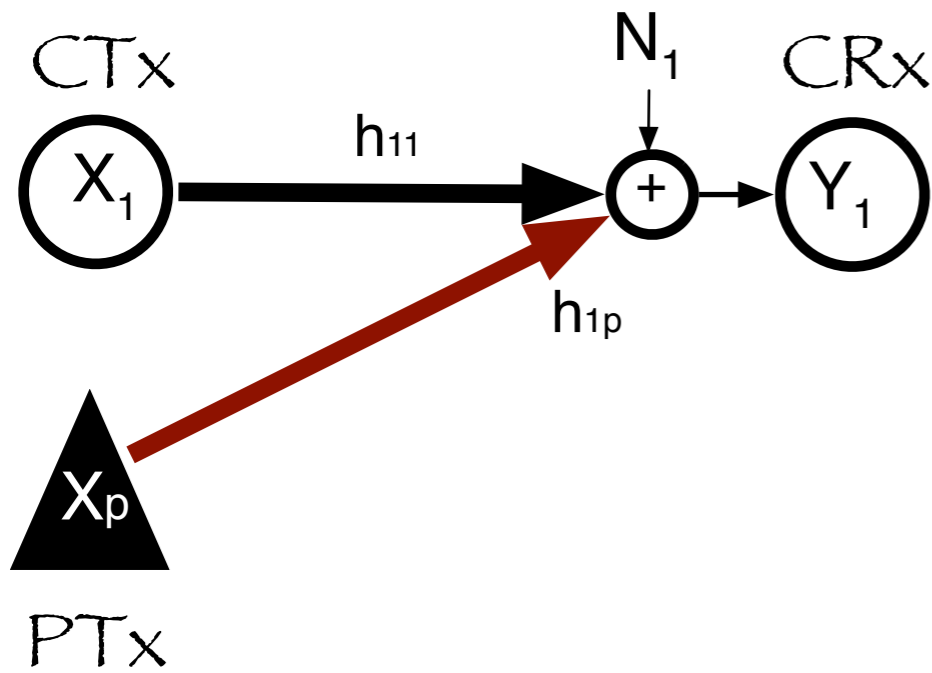
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Fixed to  $R_p^* \Rightarrow$  find  $R_c$

# “Opportunistically:”



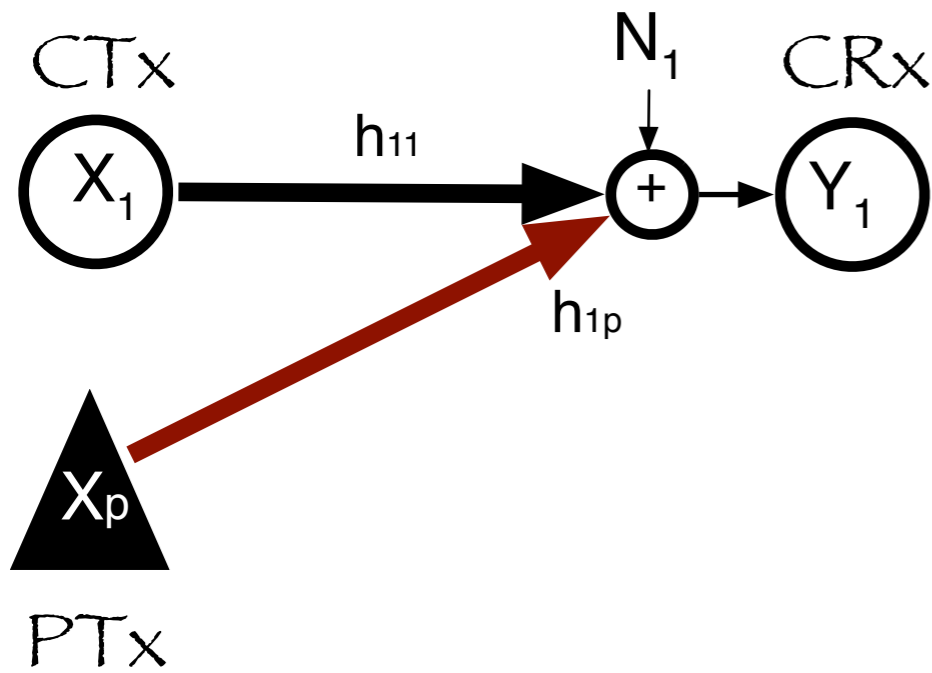
$$\begin{aligned} R_c &\leq I(X_1; Y_1 | X_p) \\ R_p &\leq I(X_p; Y_1 | X_1) \\ R_c + R_p &\leq I(X_1, X_p; Y_1) \end{aligned}$$

$R_p^*$  fixed by primary

Case 1:  $\gamma_{p1}$  large , **opportunistically cancel PTx message**

$$Y_1 = h_{11}X_1 + h_{p1}X_p + N_1$$

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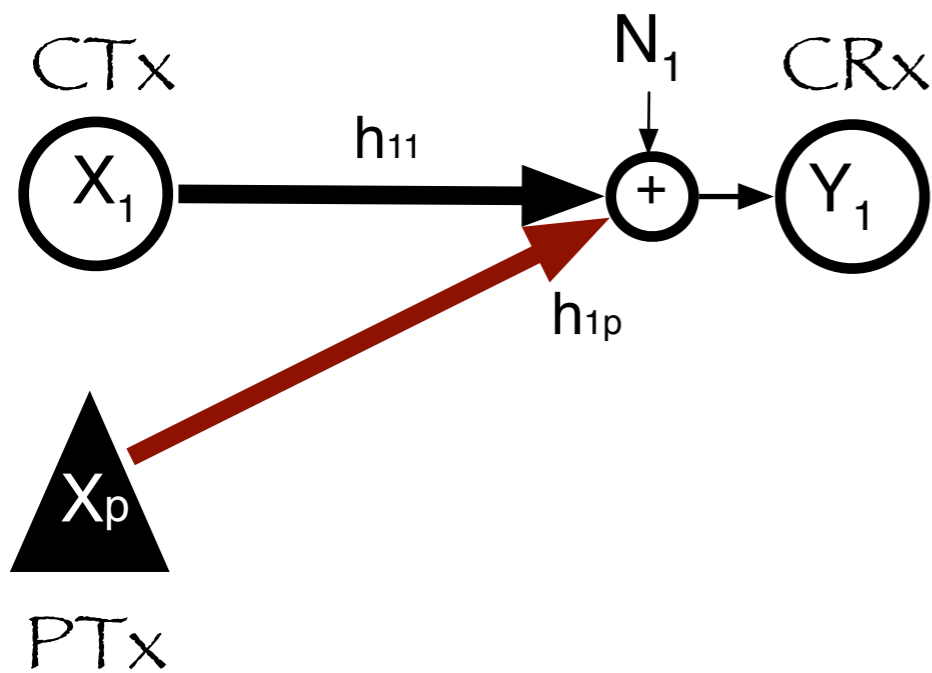
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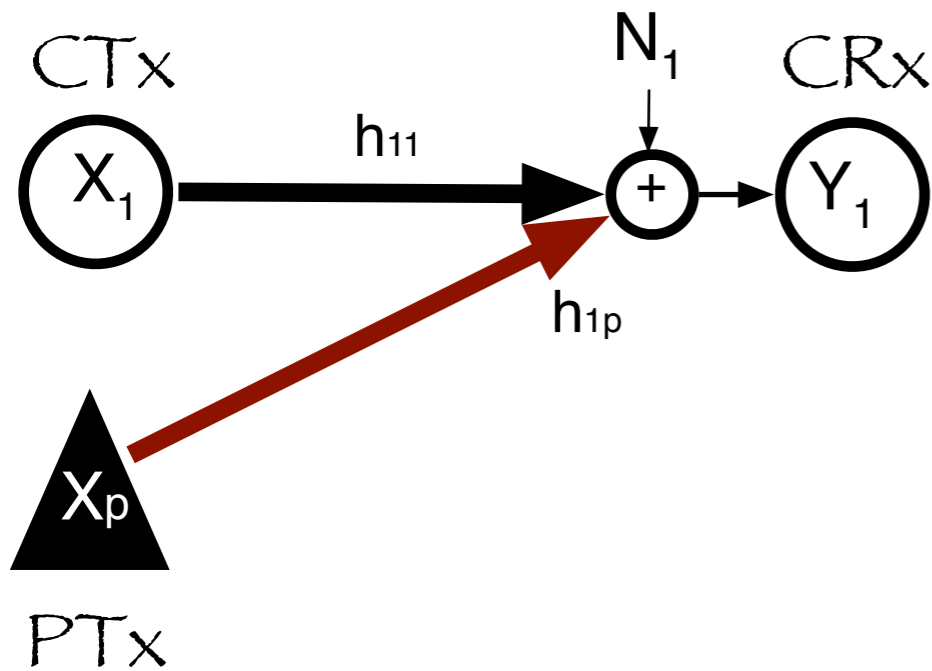
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$$Y_1 = h_{11}X_1 + \cancel{h_{p1}X_p} + N_1$$

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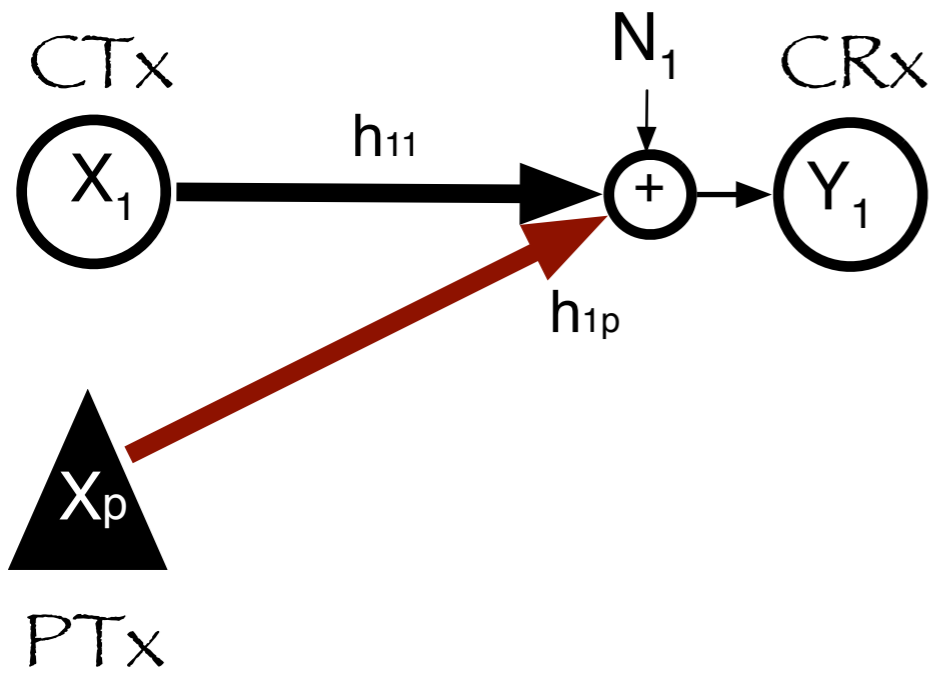
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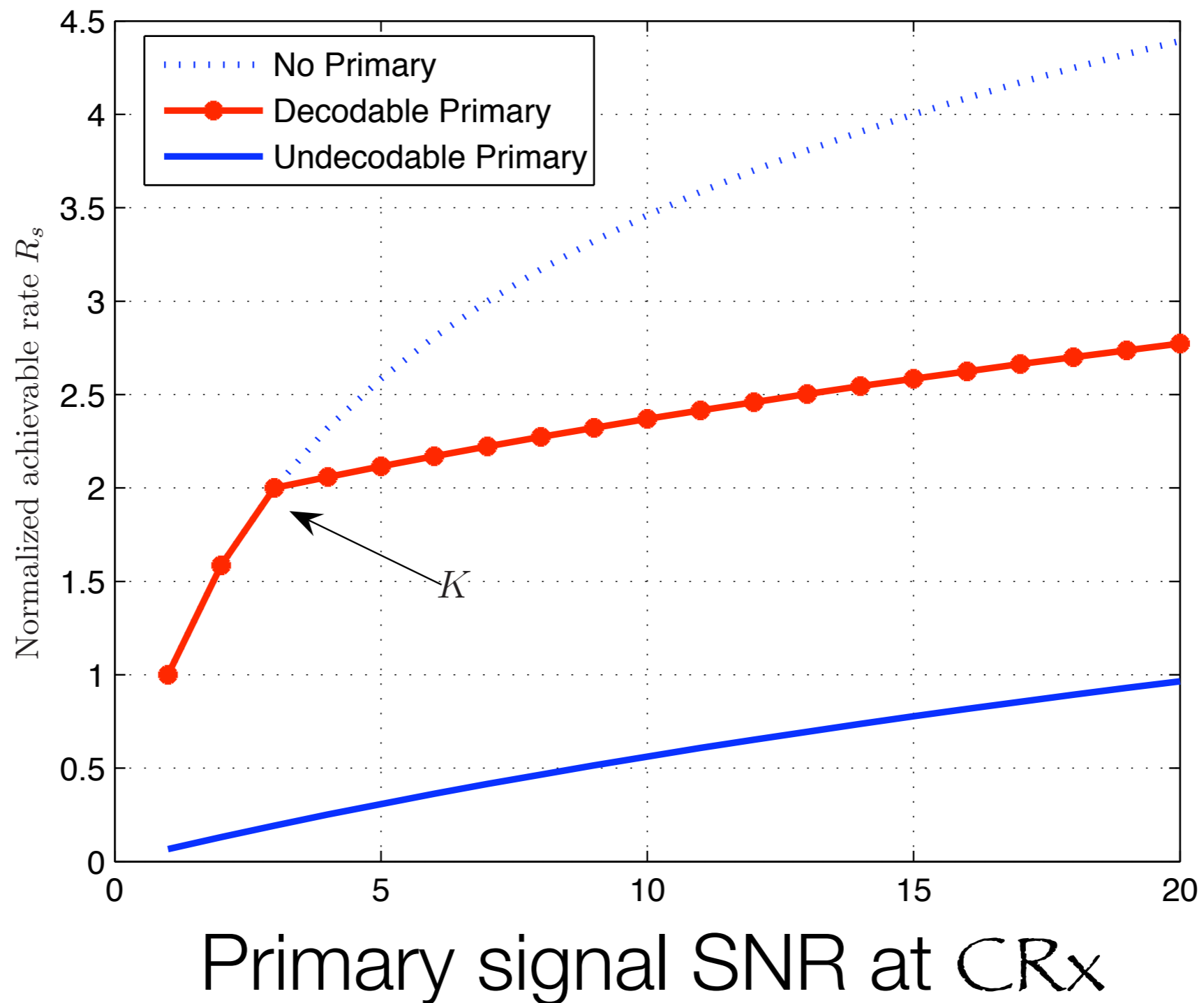
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} gets rates  
 $R_c$

[P. Popovski, H. Yomo, K. Nishimori, R. D. Taranto, and R. Prasad, DYSPAN 2007]





What about **OIC** in *networks* of cognitive users?

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Same idea - use primary codebook knowledge to **decode and cancel** primary message when channel conditions permit!

# Networks with **OIC** assumptions

---

- **Interference margin:** single primary user operates at a positive  $I_0$

$$R_p = \log \left( 1 + \frac{|h_{pp}|^2}{1+I_0} \right)$$

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- **Codebook knowledge:** all CRxs have primary codebook knowledge
- **Primary remains oblivious to secondary operation:** primary continues to operate as usual and does not change ANY of its behavior! Support legacy systems!

# Networks with **OIC** assumptions

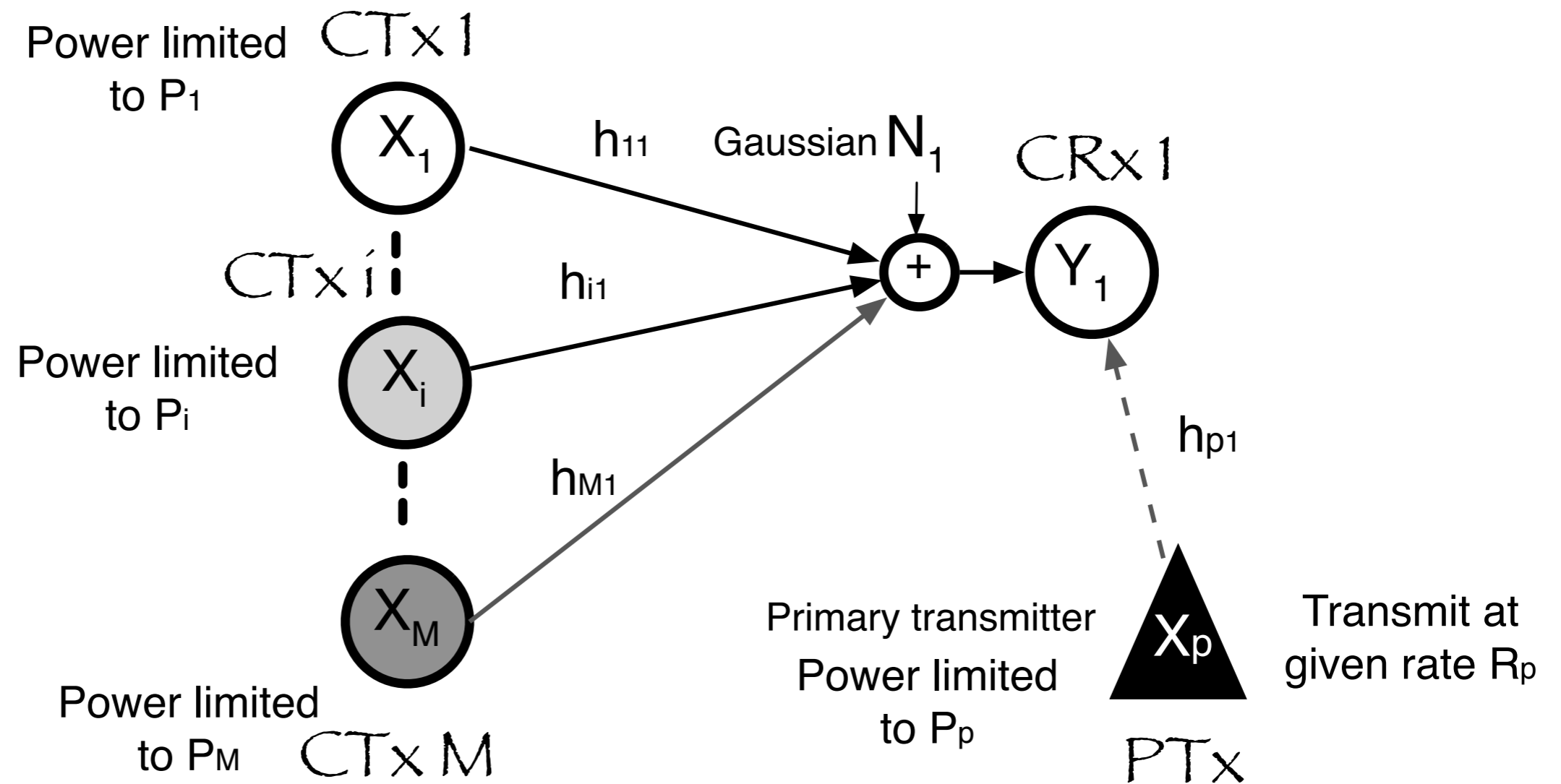
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- **Interference margin:** single primary user operates at a positive  $I_0$

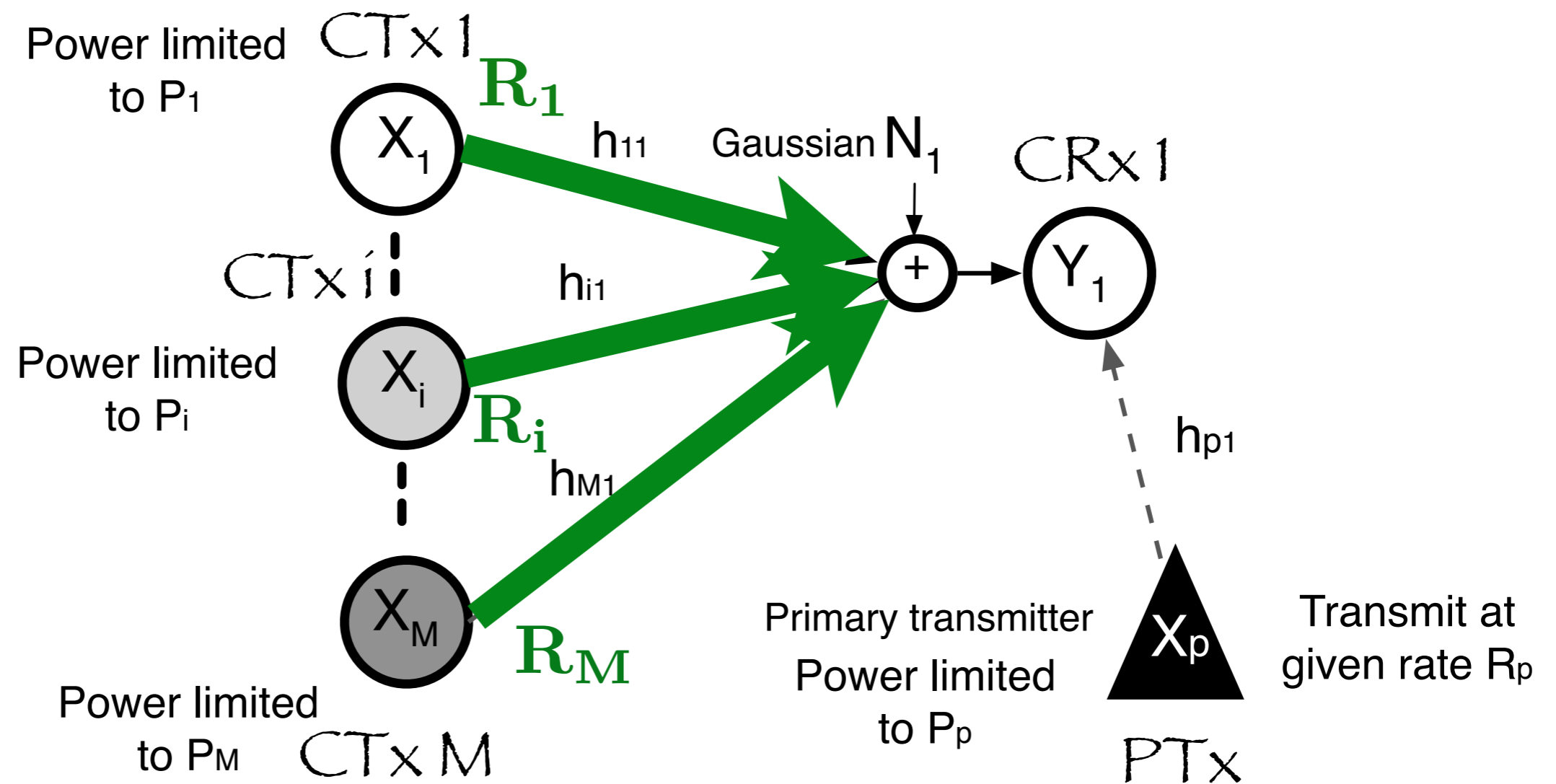
$$R_p = \log \left( 1 + \frac{|h_{pp}|^2}{1+I_0} \right)$$

- **Codebook knowledge:** all CRxs have primary codebook knowledge
- **Primary remains oblivious to secondary operation:** primary continues to operate as usual and does not change ANY of its behavior! Support legacy systems!
- **Channel knowledge assumption:** CTxs and CRxs assumed to know quasi-static channel gains  $h_{ij}$

# Multiple Access Channel with OIC



# Multiple Access Channel with OIC

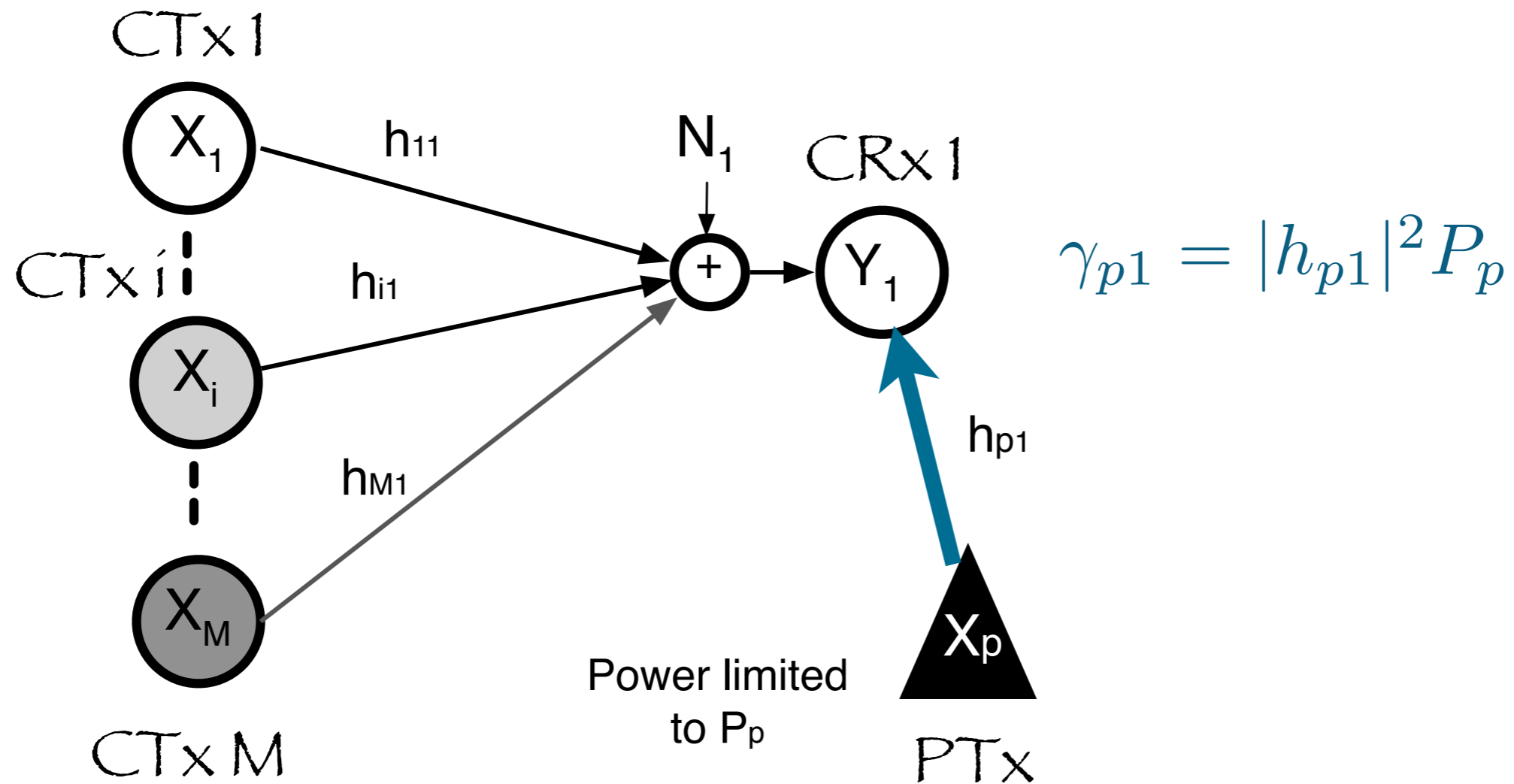


***What secondary rates can we achieve?***

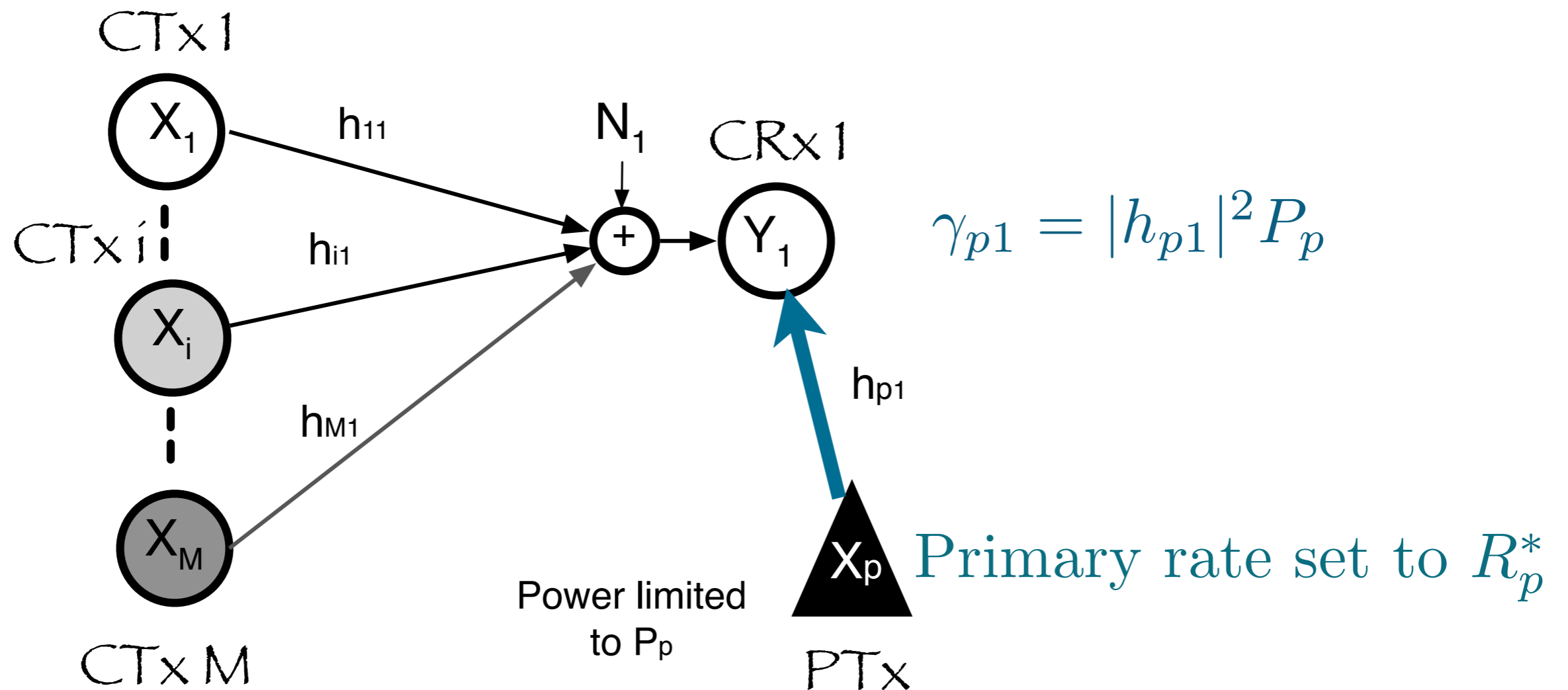


# Multiple Access Channel with OIC

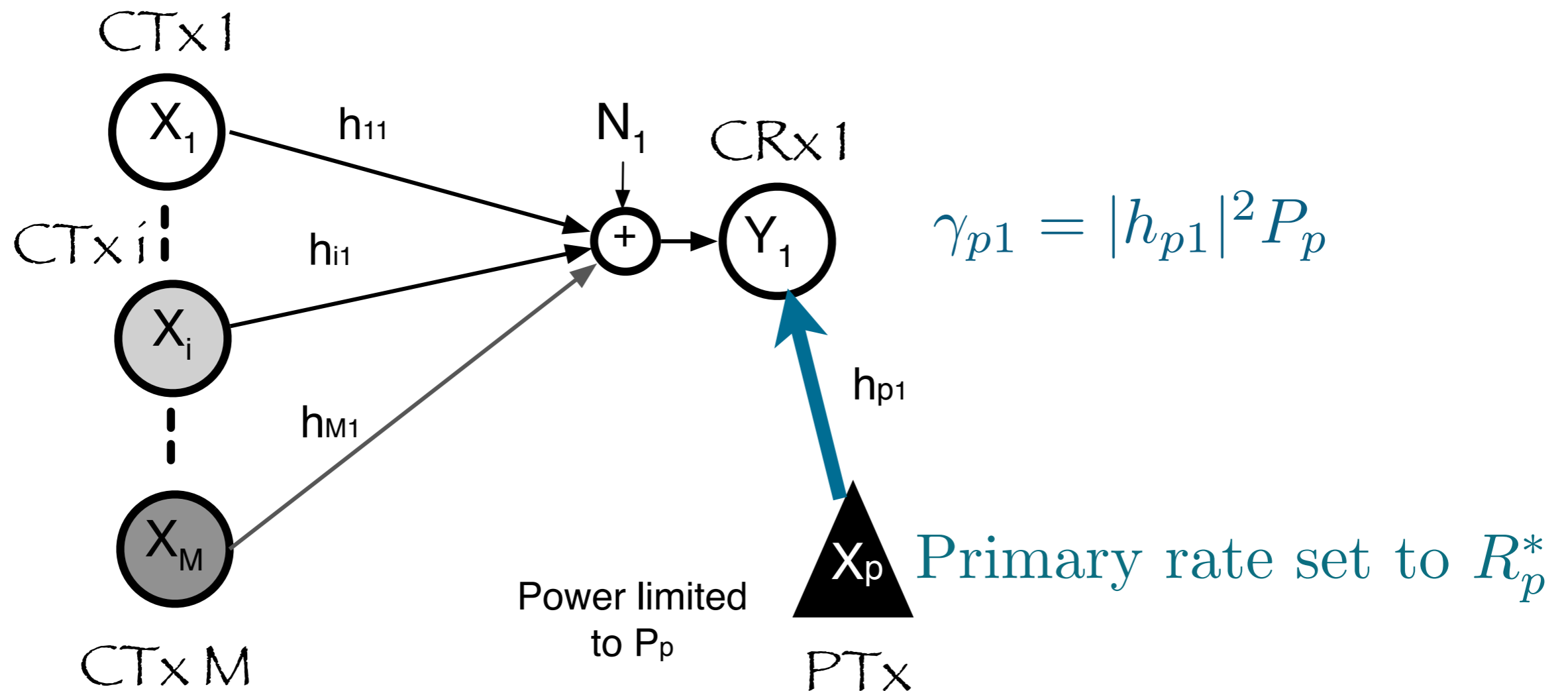
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# Multiple Access Channel with OIC

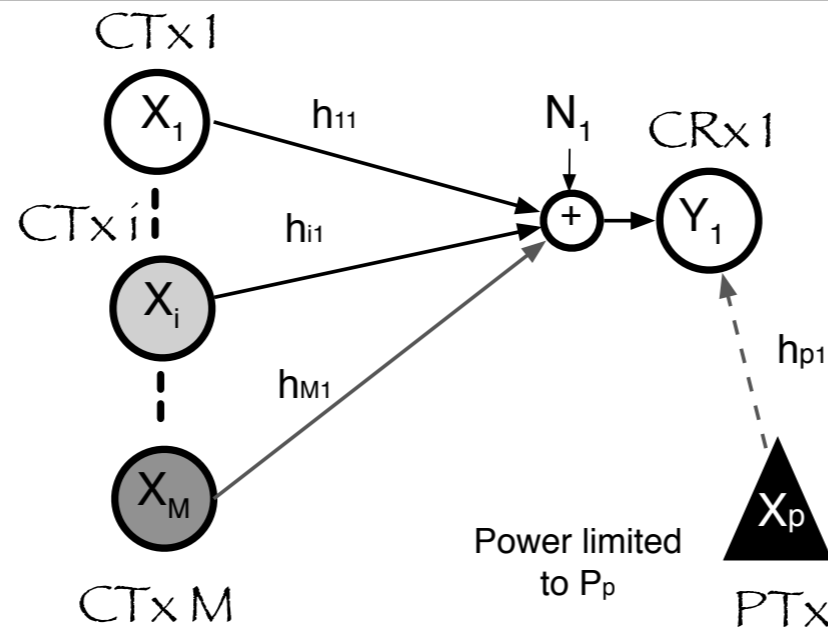


# Multiple Access Channel with OIC



Relative values of  $\gamma_{p1}$  and  $R_p^*$  will allow/prevent OIC

# Multiple access channel with OIC

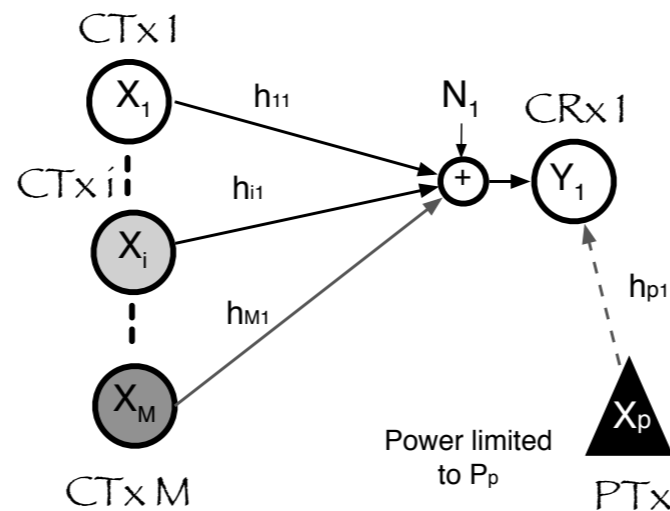


- divide into cases: decode PTx message at or not
- for each case, obtain region as  $M+1$  user MAC channel with FIXED  $R_p^*$
- take union over power constraints

$P_{MAC} = \{(P_1, P_2, \dots, P_M) \text{ such that}$

$$|h_{1p}|^2 P_1 + |h_{2p}|^2 P_2 + \dots + |h_{Mp}|^2 P_M \leq I_{margin}\}.$$

**(FAST)**



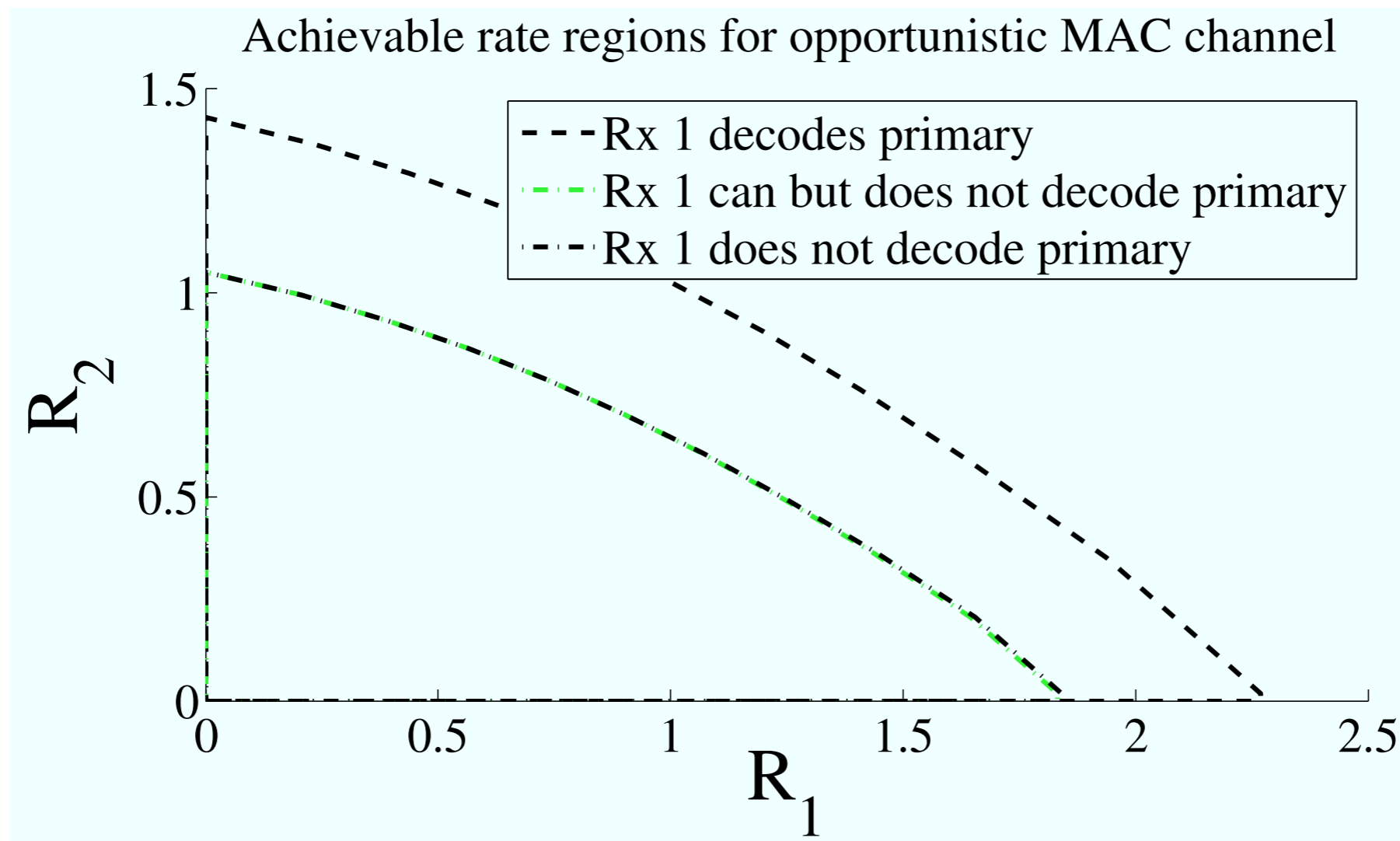
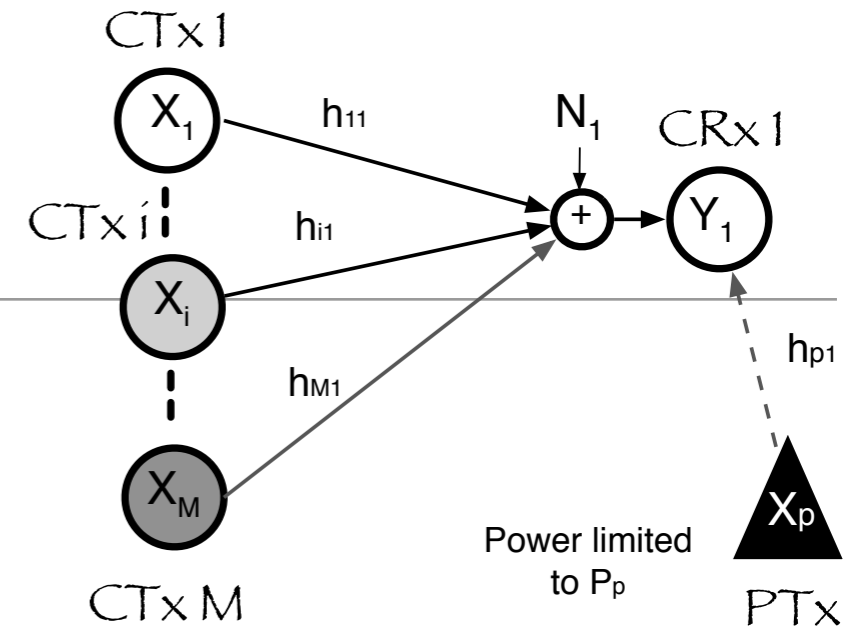
For a given  $R_p^*$ ,  $\gamma_{p1}$ , an achievable rate region  $\mathcal{R}_{MAC}$  is given by the convex hull of the union over all  $\mathbf{P} = (P_1, P_2, \dots, P_M) \in \mathcal{P}_{MAC}$  of the regions  $\mathcal{R}(\mathbf{P}) = (R_1, R_2, \dots, R_p)$  such that if  $R_p^* \geq C(\gamma_{p1})$ , the primary signal is treated as noise, resulting in the region:

$$\bigcap_{T \subset \{1, 2, \dots, M\}} \left( \sum_{t \in T} R_t \right) \leq I(Y_1; \mathbf{X}_T | \mathbf{X}_{\bar{T}}),$$

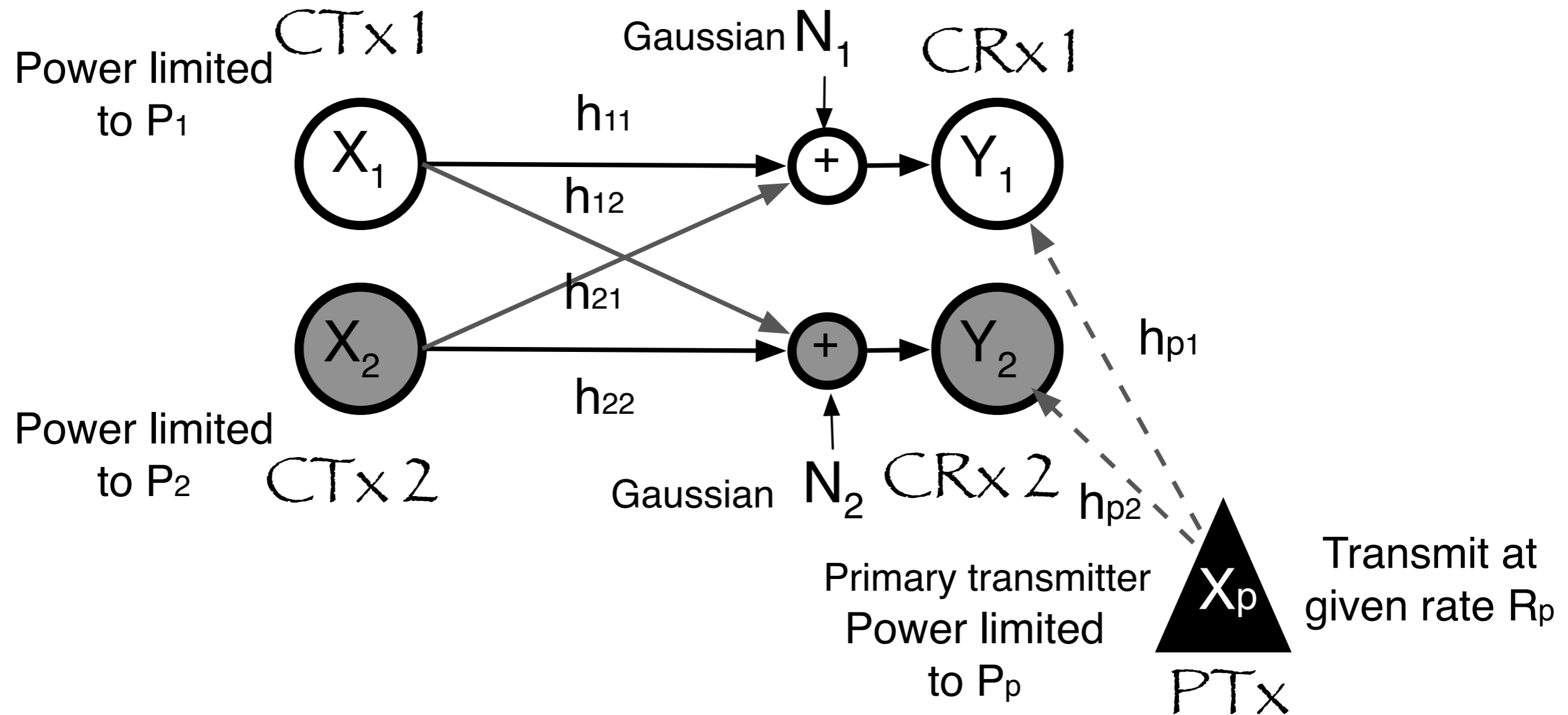
and if  $R_p^* < C(\gamma_{p1})$  then the primary signal may be decoded at CRx 1, resulting in the region

$$\bigcap_{\substack{T \subset \{1, 2, \dots, M, p\} \\ T \neq \{p\}}} \left( \sum_{t \in T} R_t \right) \leq I(Y_1; \mathbf{X}_T | \mathbf{X}_{\bar{T}}), \quad \text{where } R_p = R_p^*.$$

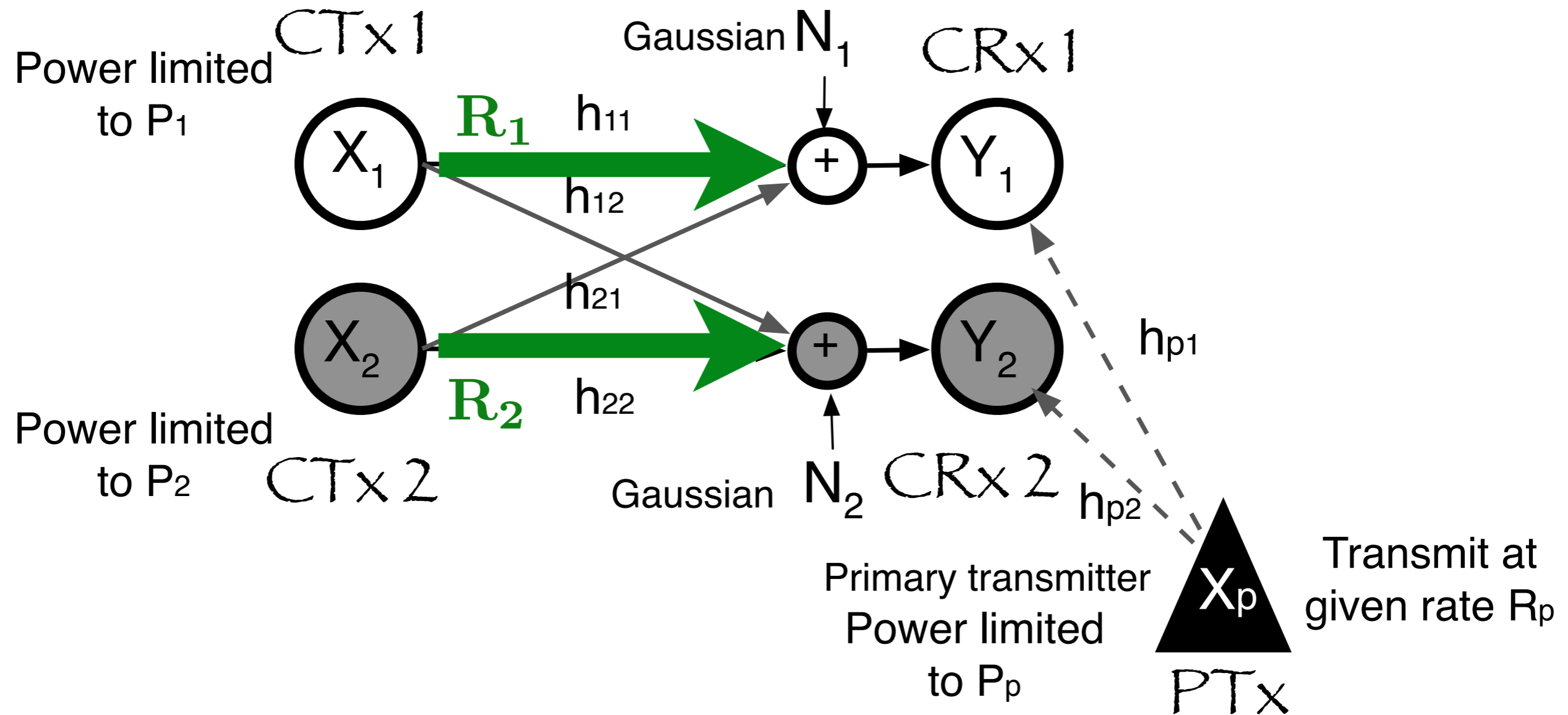
# Multiple access channel with OIC



# Interference channel with OIC



# Interference channel with OIC

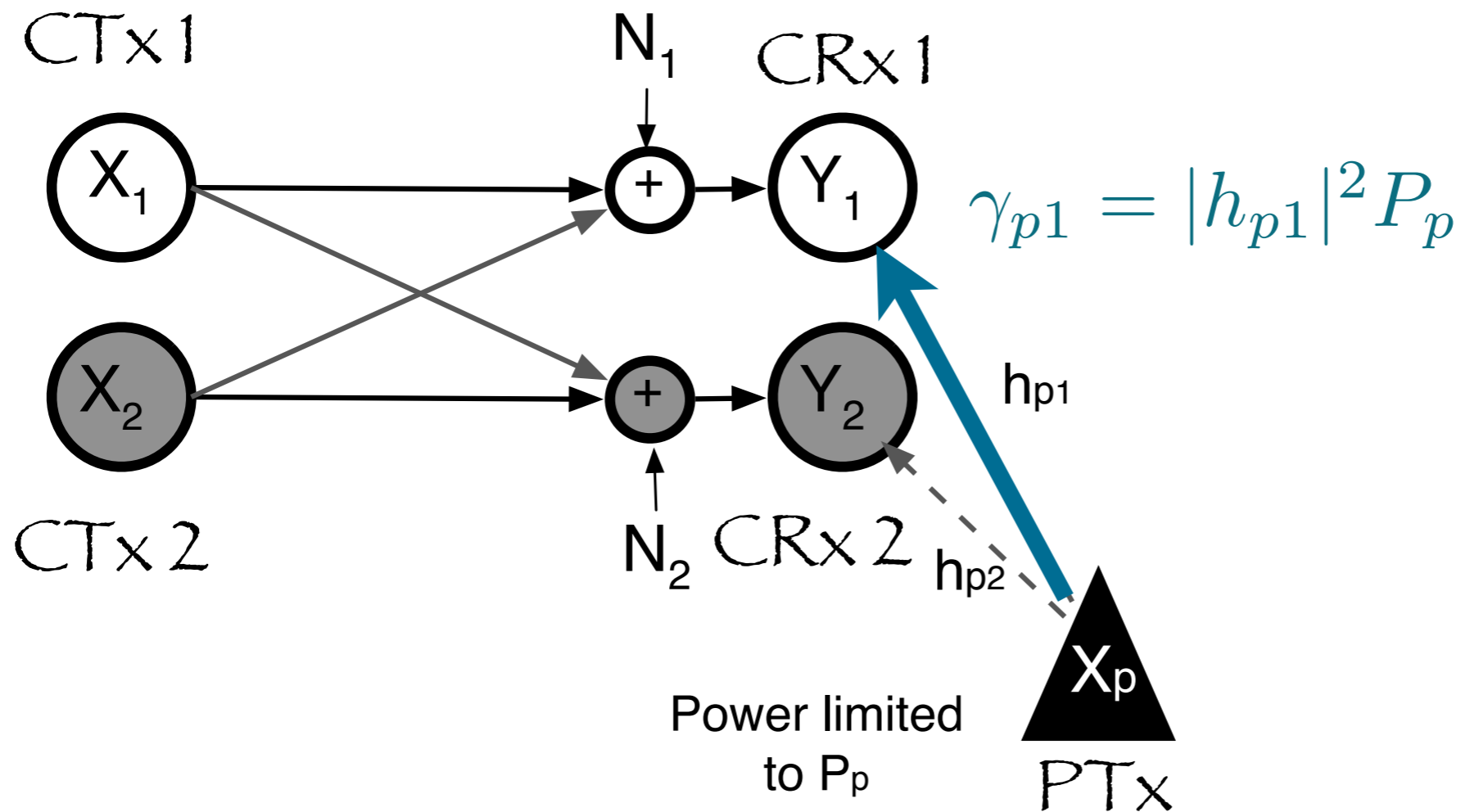


***What secondary rates can we achieve?***



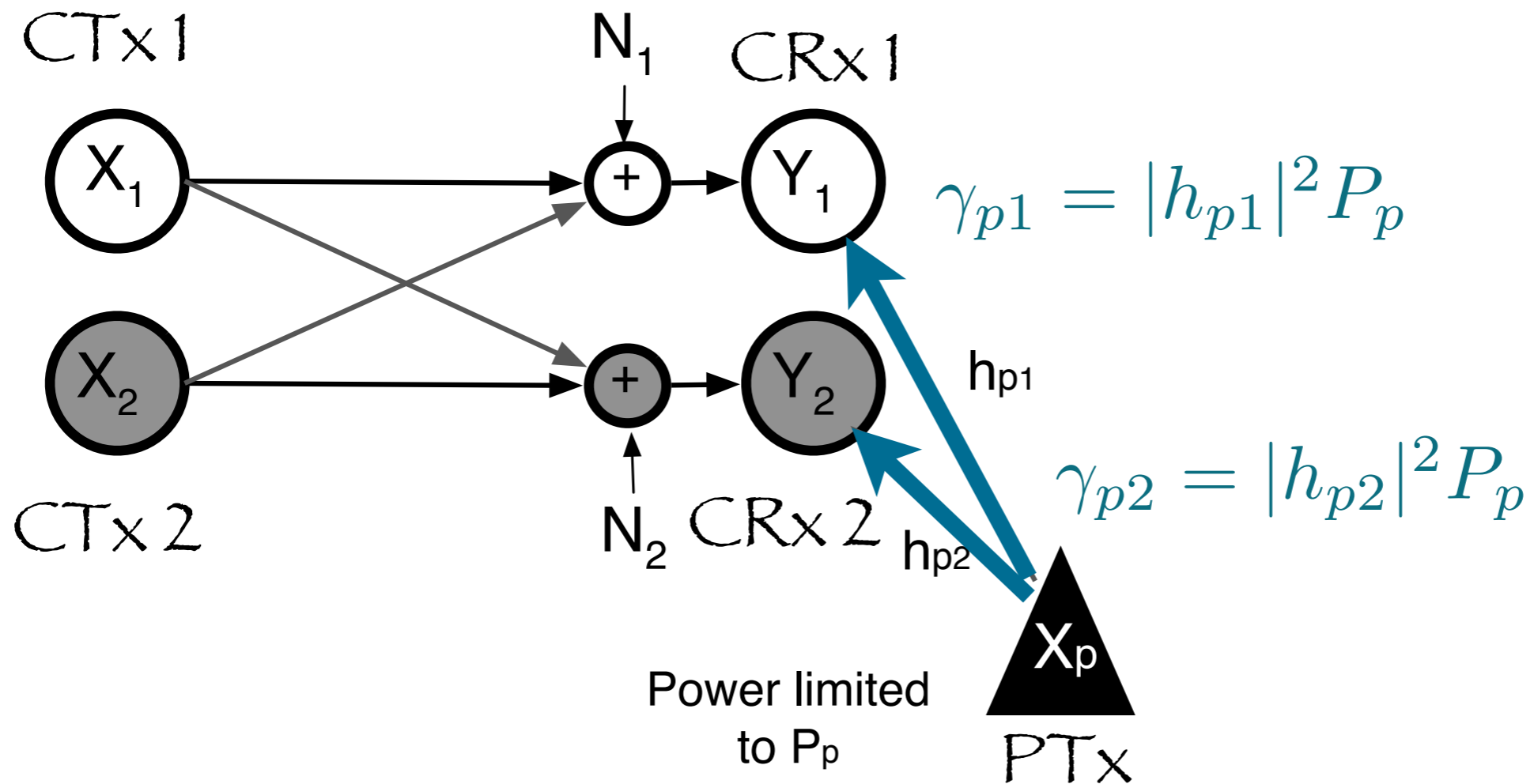
# Interference channel with OIC

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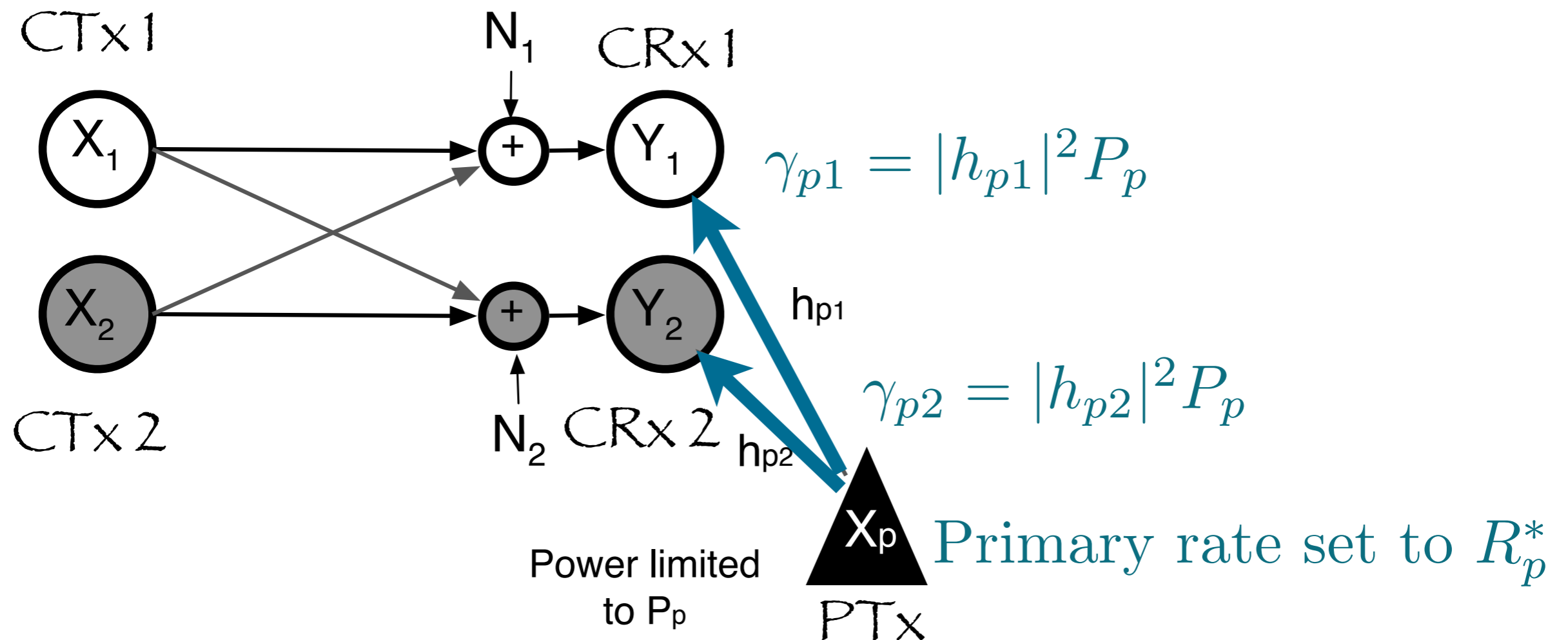


# Interference channel with OIC

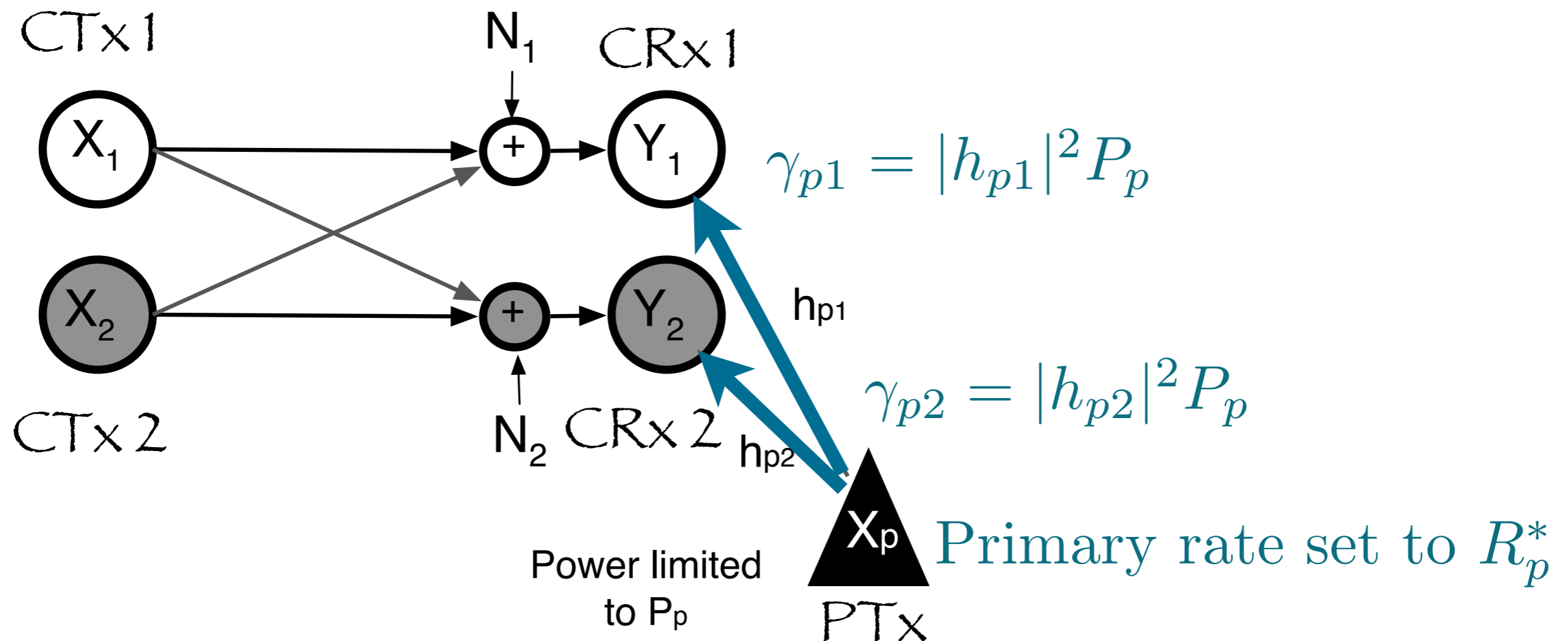
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# Interference channel with OIC

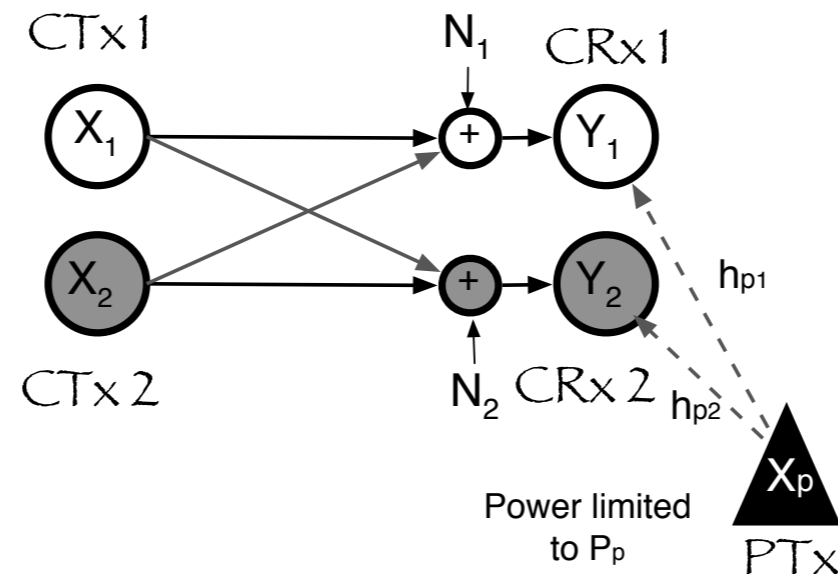


# Interference channel with OIC



Relative values of  $\gamma_{p1}$ ,  $\gamma_{p2}$ ,  $R_p^*$  will allow/prevent OIC

# Interference channel with OIC



- divide into cases: decode PTx message at one, both or neither CRx
- for each case, obtain region as known achievable rate region (3 user extension of Han + Kobayashi region for interference channel) with FIXED  $R_p^*$
- take union over power constraints

$$P_{INT} = \{ (P_1, P_2) \text{ such that } |h_{1p}|^2 P_1 + |h_{2p}|^2 P_2 \leq I_{margin} \} .$$

For a given  $R_p^*$ ,  $\gamma_{p1}$  and  $\gamma_{p2}$ , an achievable rate region  $\mathcal{R}_{INT}$  is given by the convex hull of the union over all  $\mathbf{P} = (P_1, P_2) \in \mathcal{P}_{INT}$  of the regions  $\mathcal{R}(\mathbf{P}) = (R_1 = R_{11} + R_{12}, R_2 = R_{21} + R_{22})$  such that:

1. If  $R_p^* \geq \max(C(\gamma_{p1}), C(\gamma_{p2}))$  then the primary signal is treated as noise at both CRxs, with resulting region:

$$\bigcap_{T \subset T_1} \left( \sum_{t_1 \in T} R_{t_1} \right) \leq I(Y_1; \mathbf{X}_T | \mathbf{X}_{\bar{T}}),$$

$$\bigcap_{T \subset T_2} \left( \sum_{t_2 \in T} R_{t_2} \right) \leq I(Y_2; \mathbf{X}_T | \mathbf{X}_{\bar{T}}).$$

2. If  $C(\gamma_{p2}) < R_p^* < C(\gamma_{p1})$ , then CRx 1 can decode the primary, while CRx 2 cannot, with resulting region:

$$\bigcap_{T \subset T_1^p, T \neq \{p\}} \left( \sum_{t_1 \in T} R_{t_1} \right) \leq I(Y_1; \mathbf{X}_T | \mathbf{X}_{\bar{T}}), \text{ for } R_p = R_p^*$$

$$\bigcap_{T \subset T_2} \left( \sum_{t_2 \in T} R_{t_2} \right) \leq I(Y_2; \mathbf{X}_T | \mathbf{X}_{\bar{T}}).$$

3. If  $C(\gamma_{p1}) < R_p^* < C(\gamma_{p2})$ , then CRx 2 can decode the primary, while CRx 1 cannot, with resulting region:

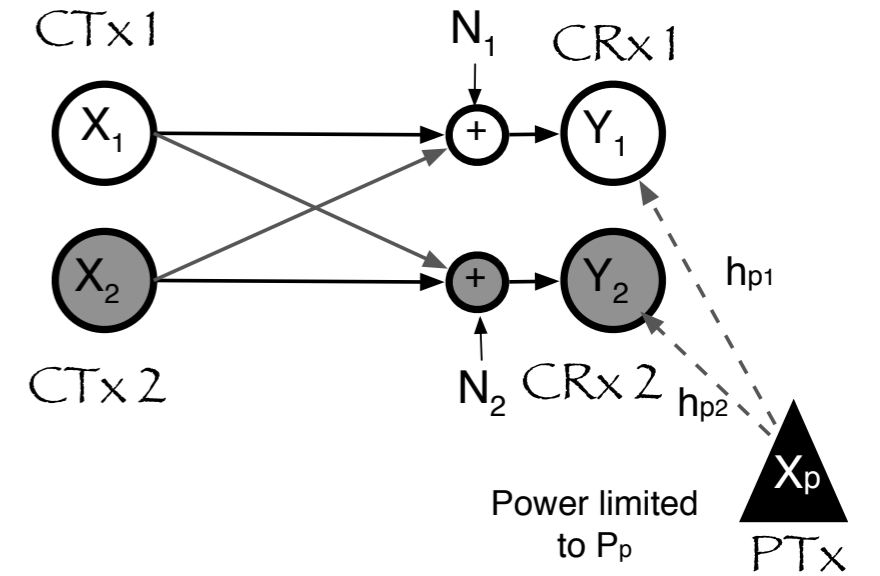
$$\bigcap_{T \subset T_1} \left( \sum_{t_1 \in T} R_{t_1} \right) \leq I(Y_1; \mathbf{X}_T | \mathbf{X}_{\bar{T}})$$

$$\bigcap_{T \subset T_2^p, T \neq \{p\}} \left( \sum_{t_2 \in T} R_{t_2} \right) \leq I(Y_2; \mathbf{X}_T | \mathbf{X}_{\bar{T}}), \text{ for } R_p = R_p^*.$$

4. If  $R_p^* < C(\gamma_{p1})$  and  $R_p^* < C(\gamma_{p2})$  then both CRxs can decode the primary message, resulting in the region:

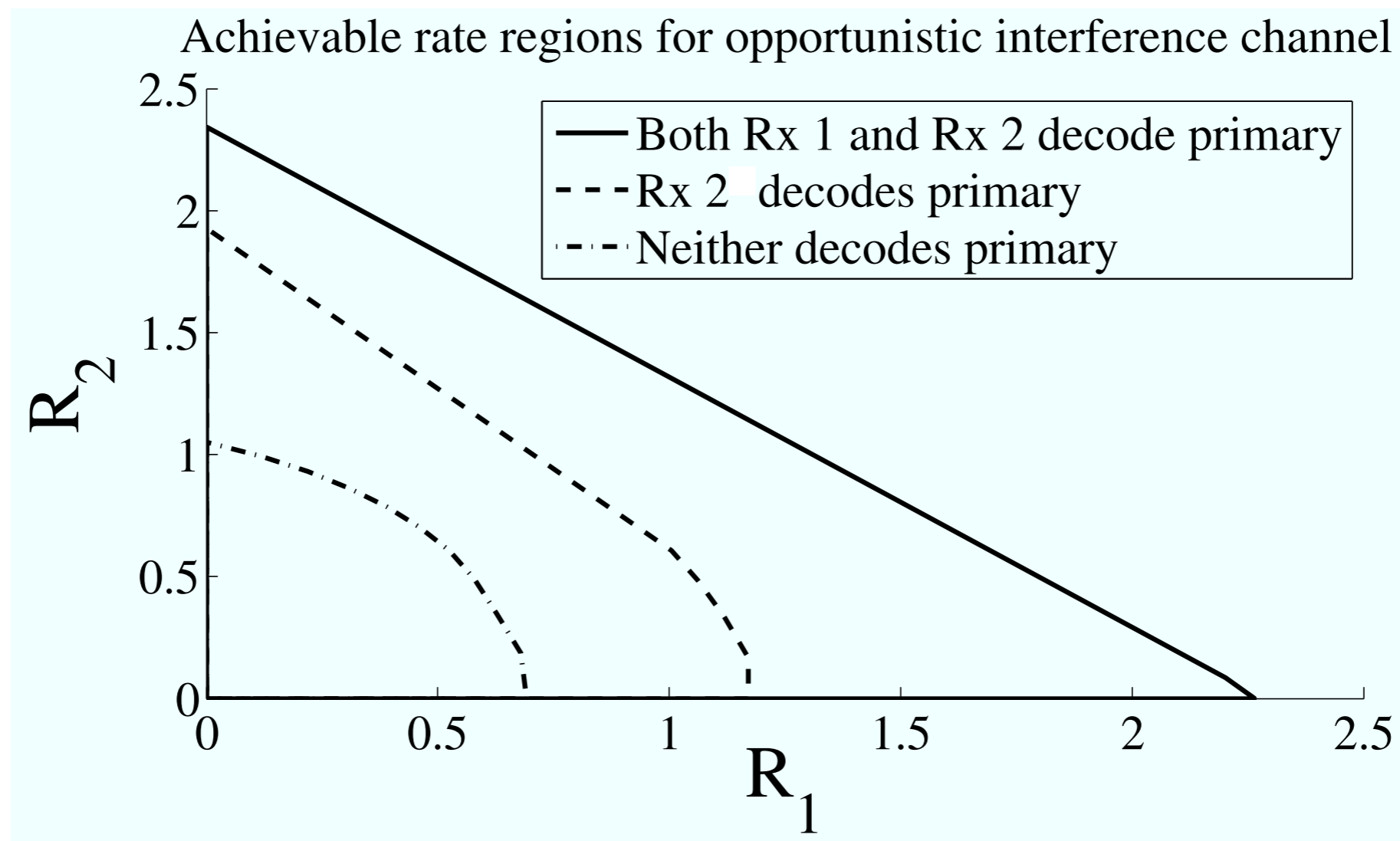
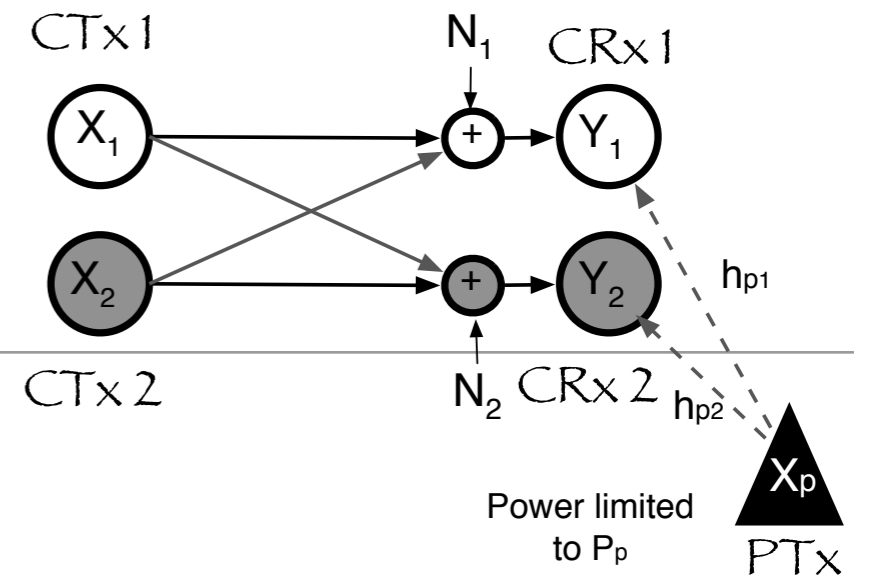
$$\bigcap_{T \subset T_1^p, T \neq \{p\}} \left( \sum_{t_1 \in T} R_{t_1} \right) \leq I(Y_1; \mathbf{X}_T | \mathbf{X}_{\bar{T}}), \text{ for } R_p = R_p^*$$

$$\bigcap_{T \subset T_2^p, T \neq \{p\}} \left( \sum_{t_2 \in T} R_{t_2} \right) \leq I(Y_2; \mathbf{X}_T | \mathbf{X}_{\bar{T}}), \text{ for } R_p = R_p^*.$$



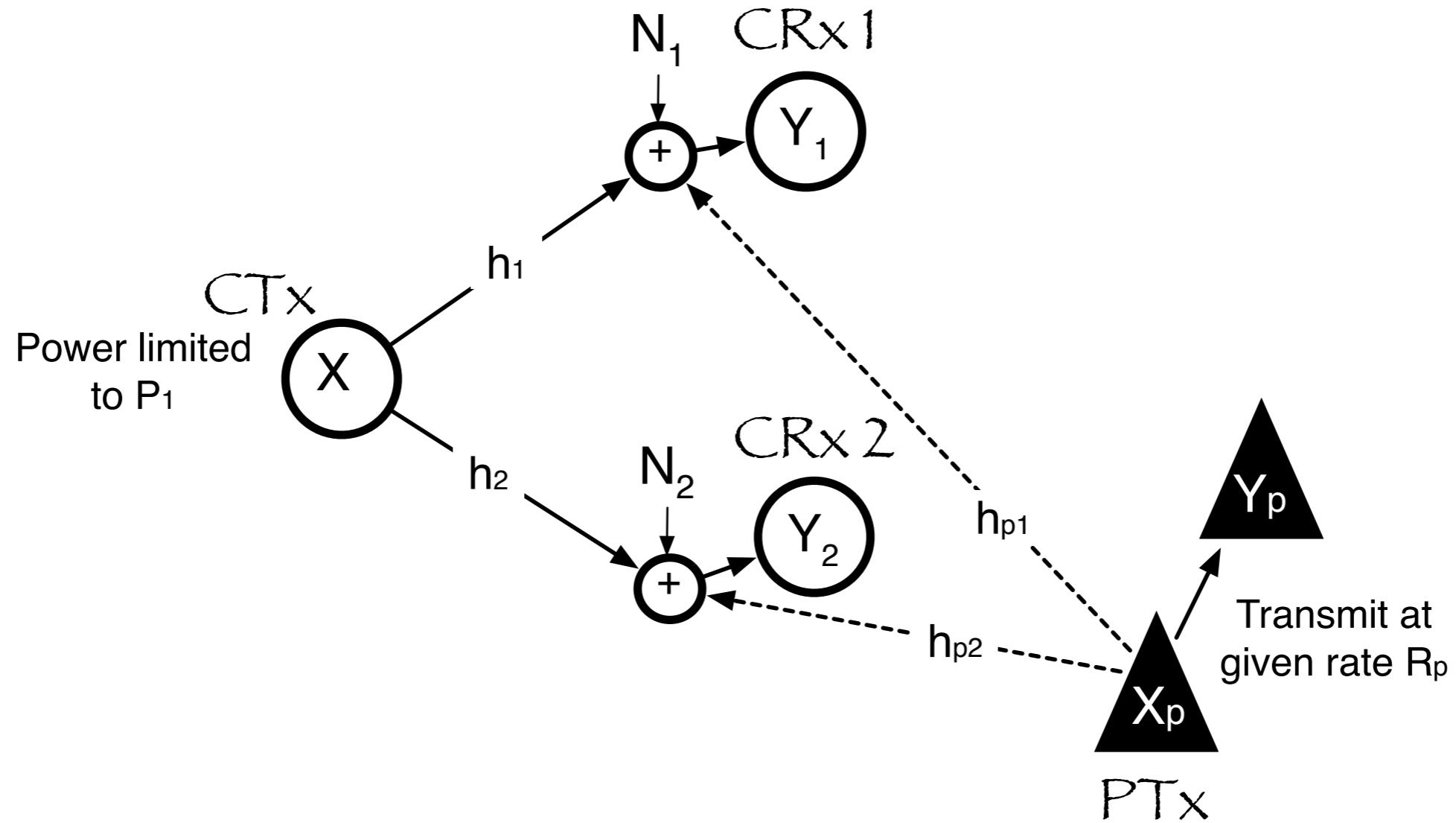
**(FAST)**

# Interference channel with OIC



# Broadcast Channel with OIC

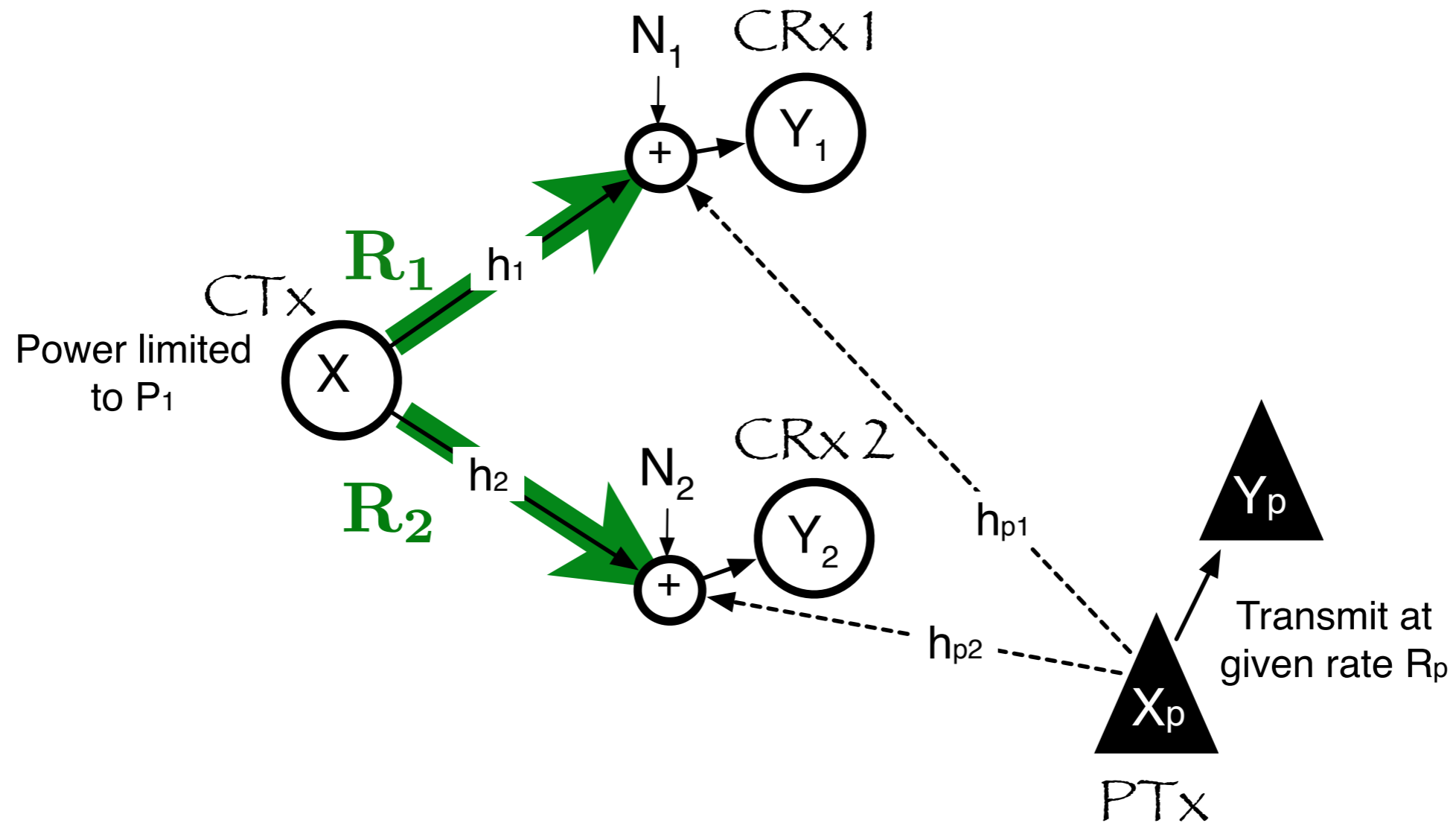
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# Broadcast Channel with OIC

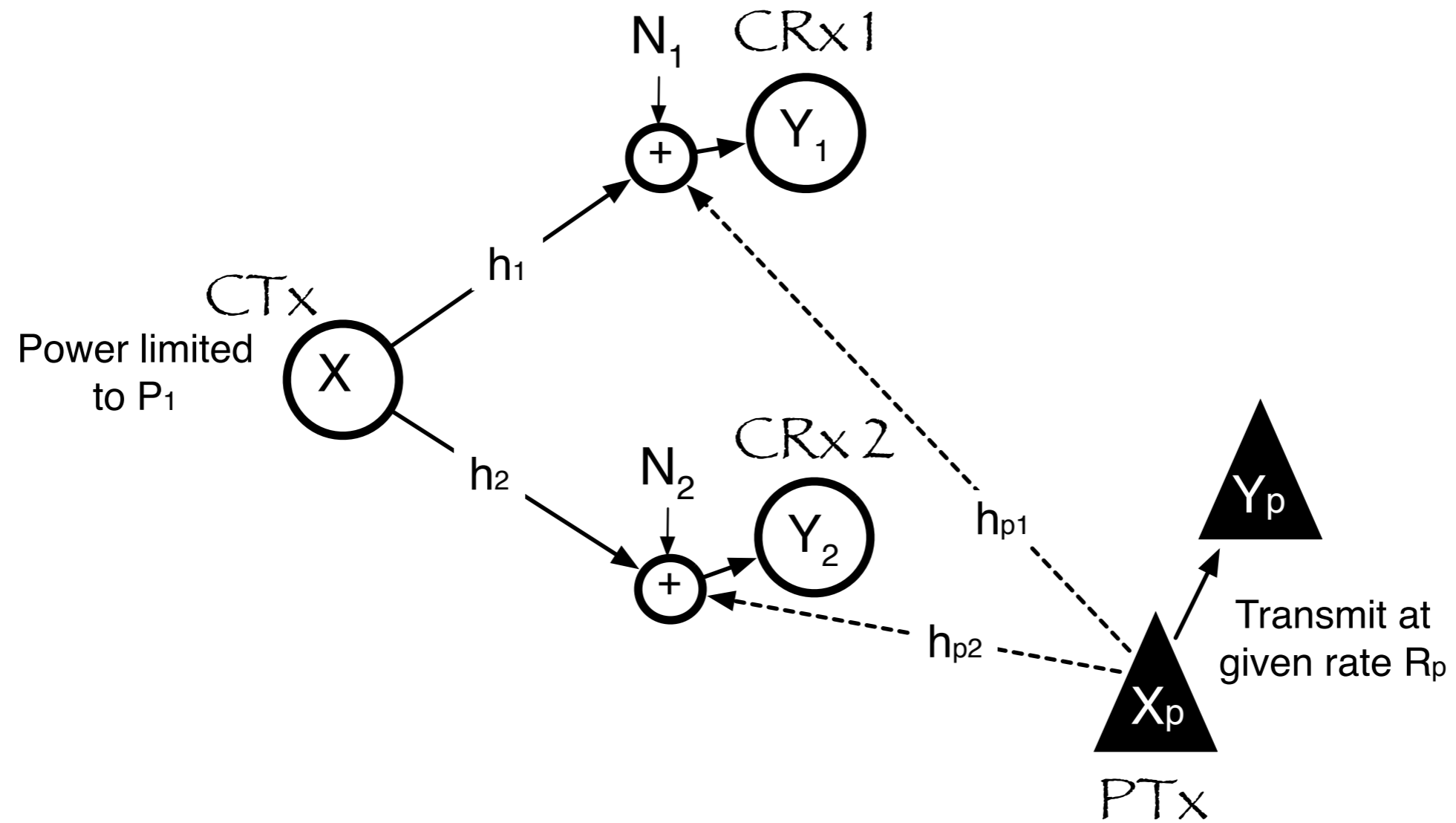
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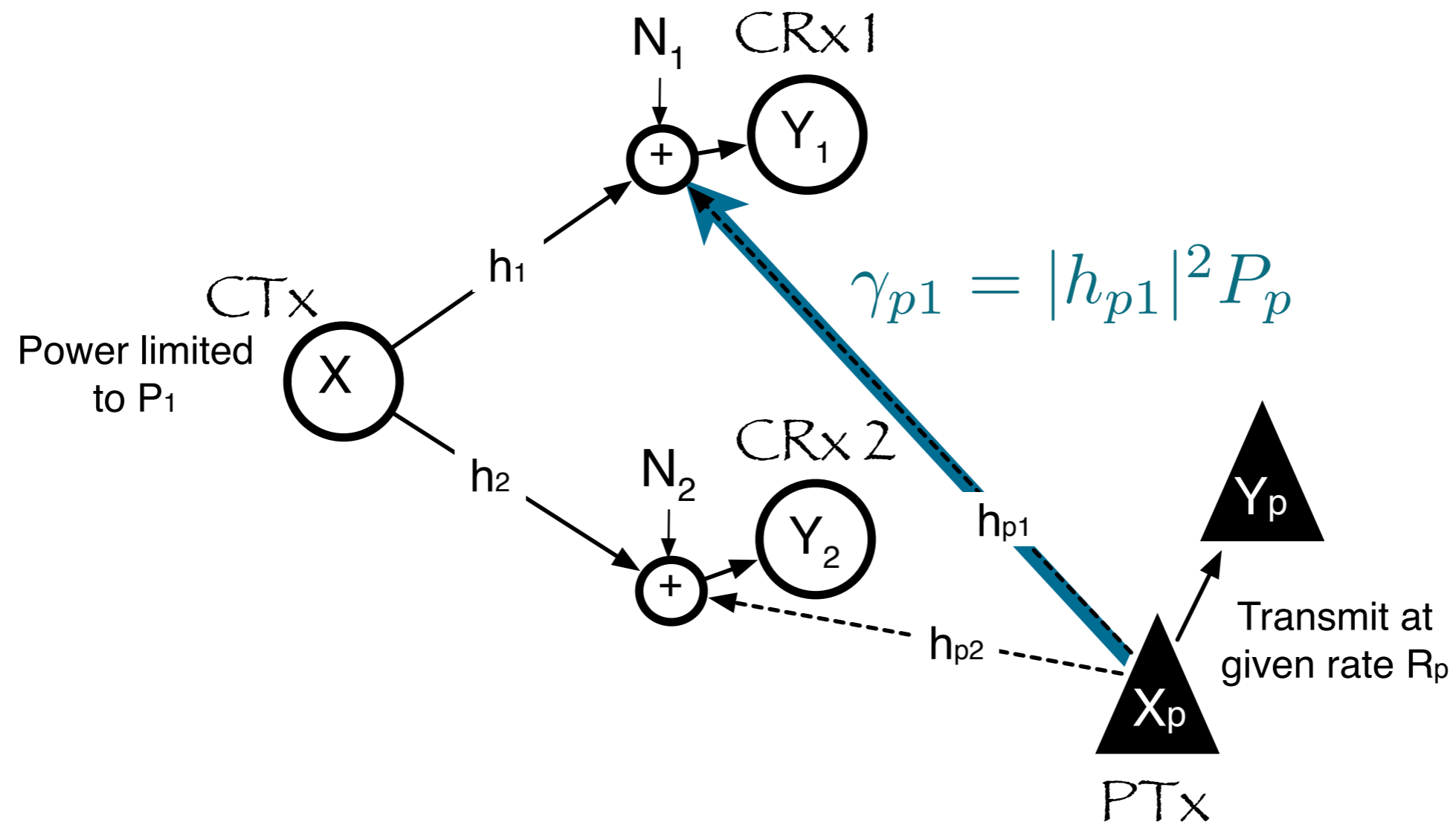
***What secondary rates can we achieve?***

# Broadcast Channel with OIC

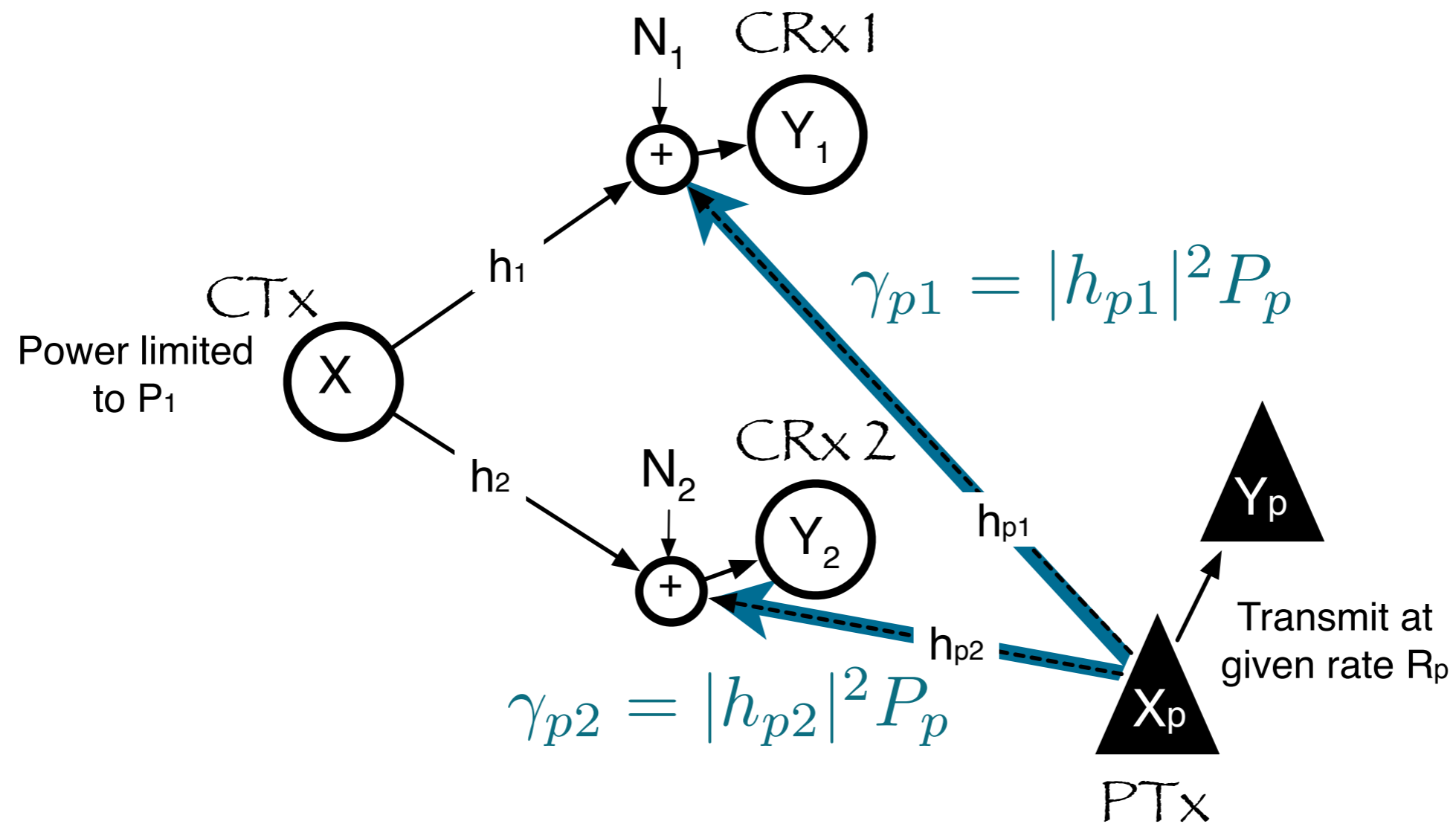
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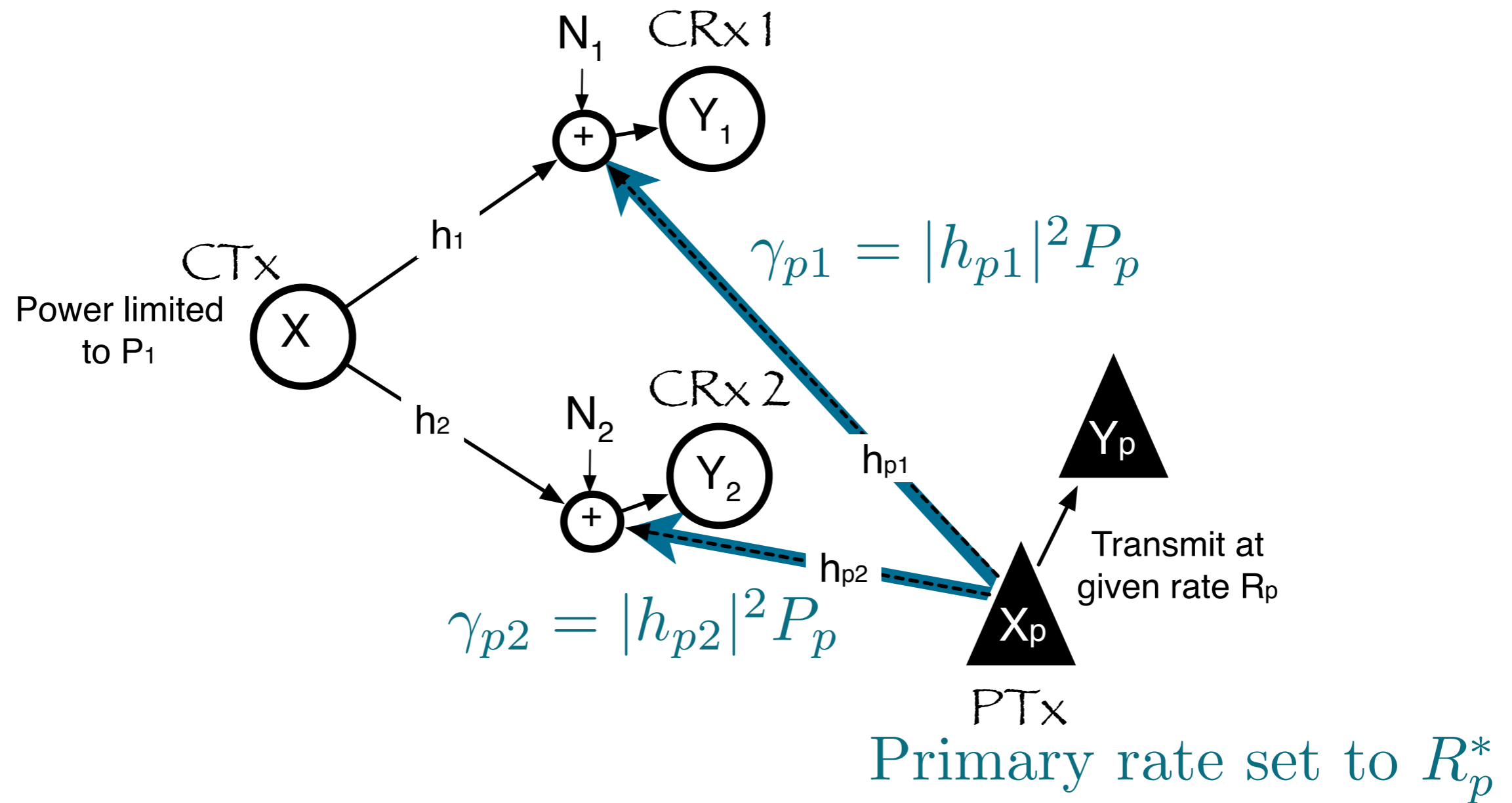
# Broadcast Channel with OIC



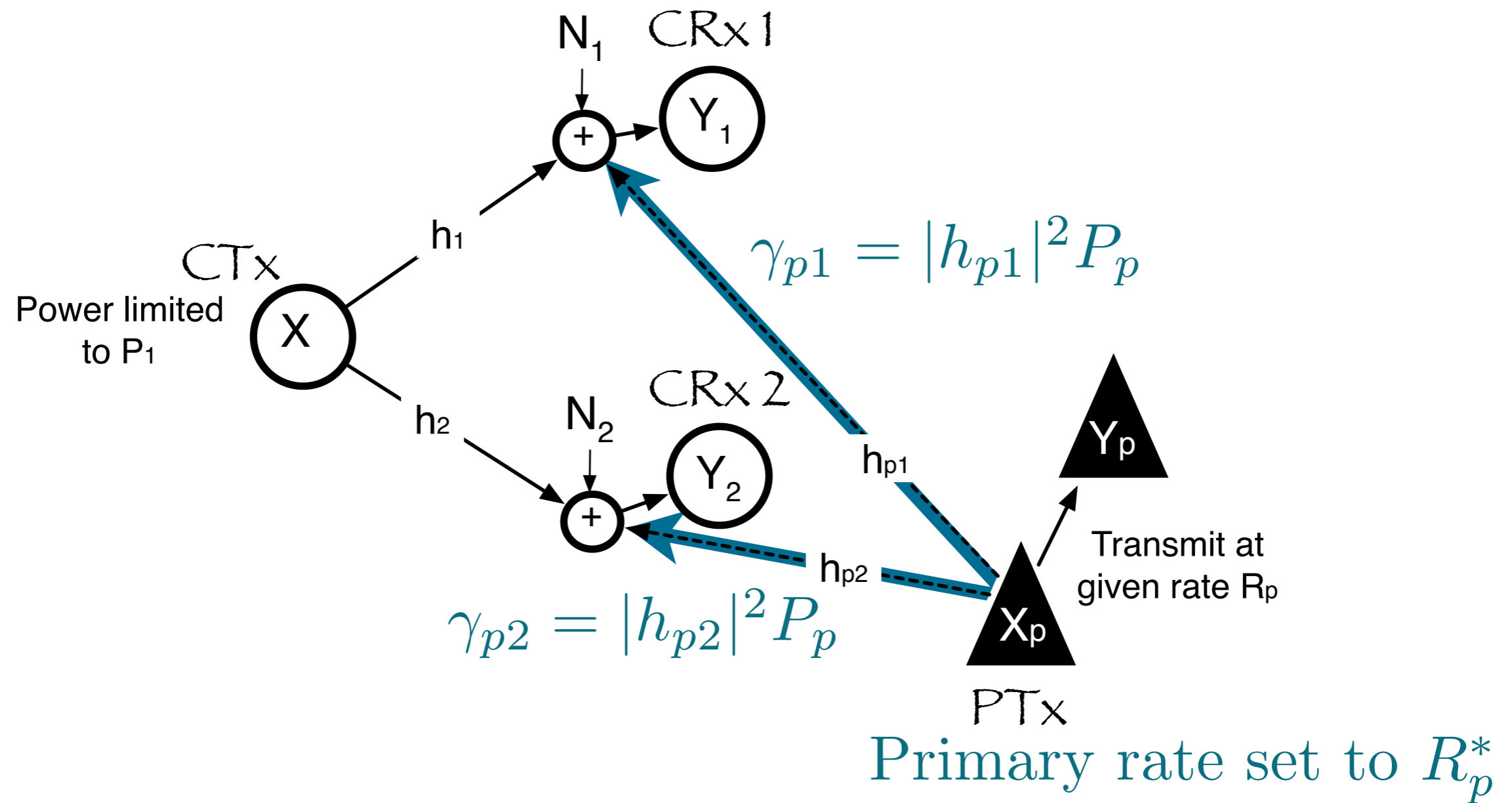
# Broadcast Channel with OIC



# Broadcast Channel with OIC



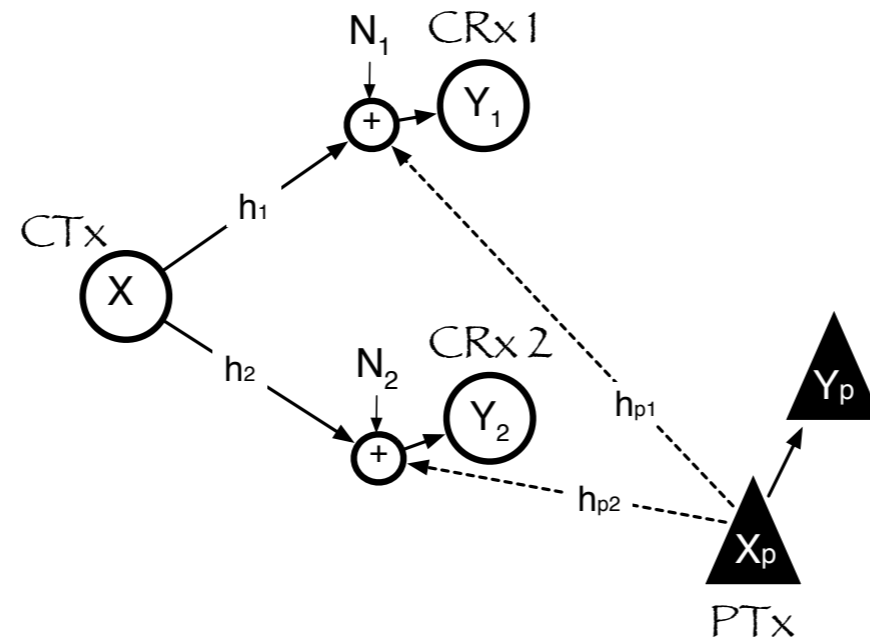
# Broadcast Channel with OIC



Relative values of  $\gamma_{p1}$ ,  $\gamma_{p2}$ ,  $R_p^*$  will allow/prevent OIC

# Broadcast channel with OIC

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- divide into cases: decode  $PT_x$  message at one, both or neither  $CR_x$
- for each case, obtain region as known achievable rate region (adjusted Marton's region) with FIXED  $R_p^*$

For a given primary rate  $R_p = R_p^*$ , and given  $\gamma_{p1}$  and  $\gamma_{p2}$ , an achievable rate region  $\mathcal{R}_{BC}$  is given by the convex hull of the union over all distributions  $p(u, v, x) = p(u, v)p(x|u, v)$  of the regions  $\mathcal{R}(\mathbf{P}) = \{(R_1, R_2)\}$  such that:

1. If  $R_p^* \geq I(X_p; Y_1|X)$  and  $R_p^* \geq I(X_p; Y_2|X)$  then the primary signal is treated as noise at both Rxs:

$$R_1 \leq I(U; Y_1) \quad R_2 \leq I(V; Y_2)$$

$$R_1 + R_2 \leq I(U; Y_1) + I(V; Y_2) - I(U; V)$$

2. If  $I(X_p; Y_2|X) < R_p^* < I(X_p; Y_1|X)$ , then CRx 1 can decode the primary, while CRx 2 cannot:

$$R_1 \leq \min(I(U; Y_1|X_p), I(U, X_p; Y_1) - R_p^*)$$

$$R_2 \leq I(V; Y_2)$$

$$R_1 + R_2 \leq \min(I(U; Y_1|X_p), I(U, X_p; Y_1) - R_p^*) + I(V; Y_2) - I(U; V)$$

3. If  $I(X_p; Y_1|X) < R_p^* < I(X_p; Y_2|X)$ , then CRx 2 can decode the primary, while CRx 1 cannot:

$$R_1 \leq I(U; Y_1)$$

$$R_2 \leq \min(I(V; Y_2|X_p), I(V, X_p; Y_2) - R_p^*)$$

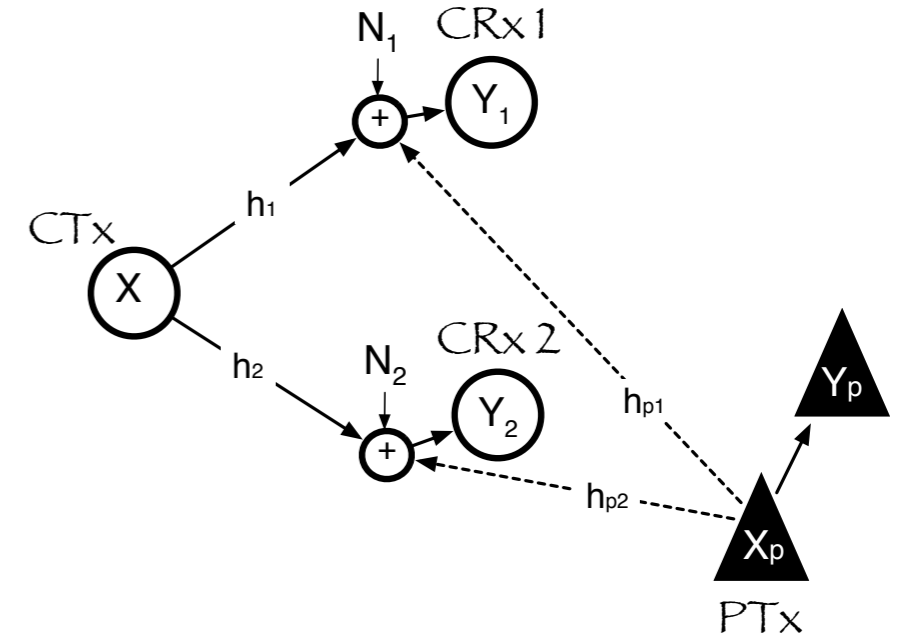
$$R_1 + R_2 \leq \min(I(V; Y_2|X_p), I(V, X_p; Y_2) - R_p^*) + I(U; Y_1) - I(U; V)$$

4. If  $R_p^* < I(X_p; Y_1|X)$  and  $R_p^* < I(X_p; Y_2|X)$  then both Rxs can decode the primary message:

$$R_1 \leq \min(I(U; Y_1|X_p), I(U, X_p; Y_1) - R_p^*)$$

$$R_2 \leq \min(I(V; Y_2|X_p), I(V, X_p; Y_2) - R_p^*)$$

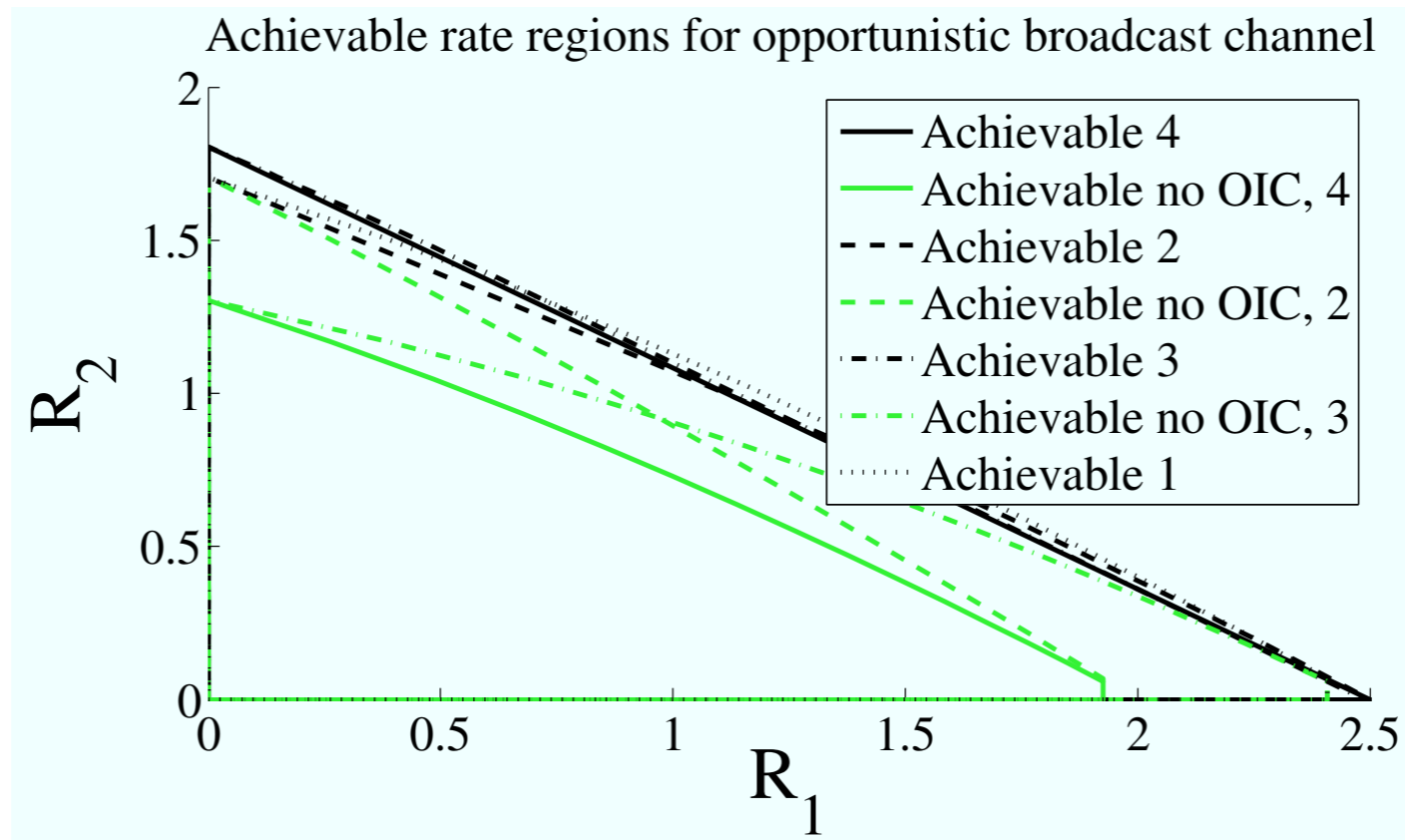
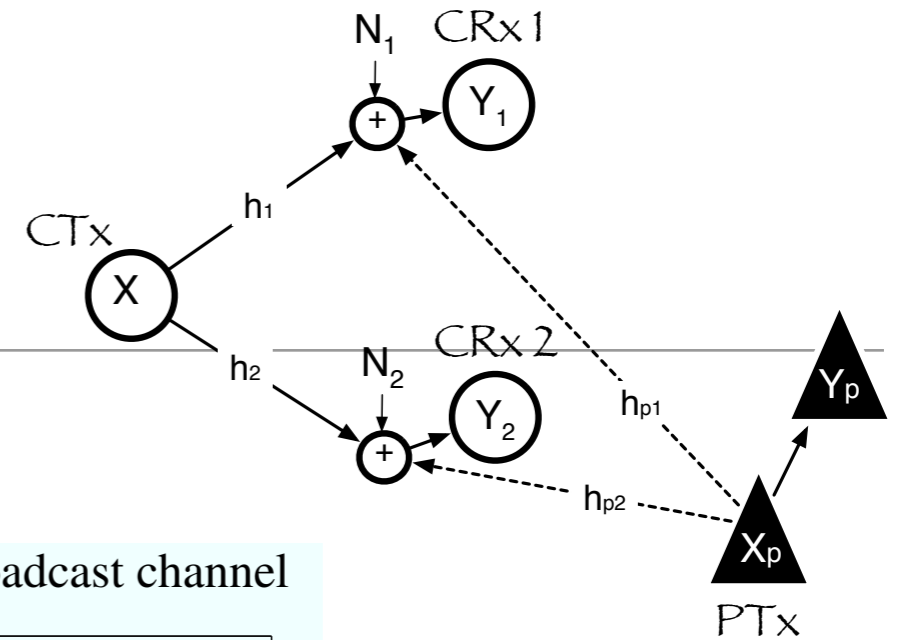
$$R_1 + R_2 \leq \min(I(U; Y_1|X_p), I(U, X_p; Y_1) - R_p^*) + \min(I(V; Y_2|X_p), I(V, X_p; Y_2) - R_p^*) - I(U; V)$$



**(FAST)**



# Broadcast Channel with OIC

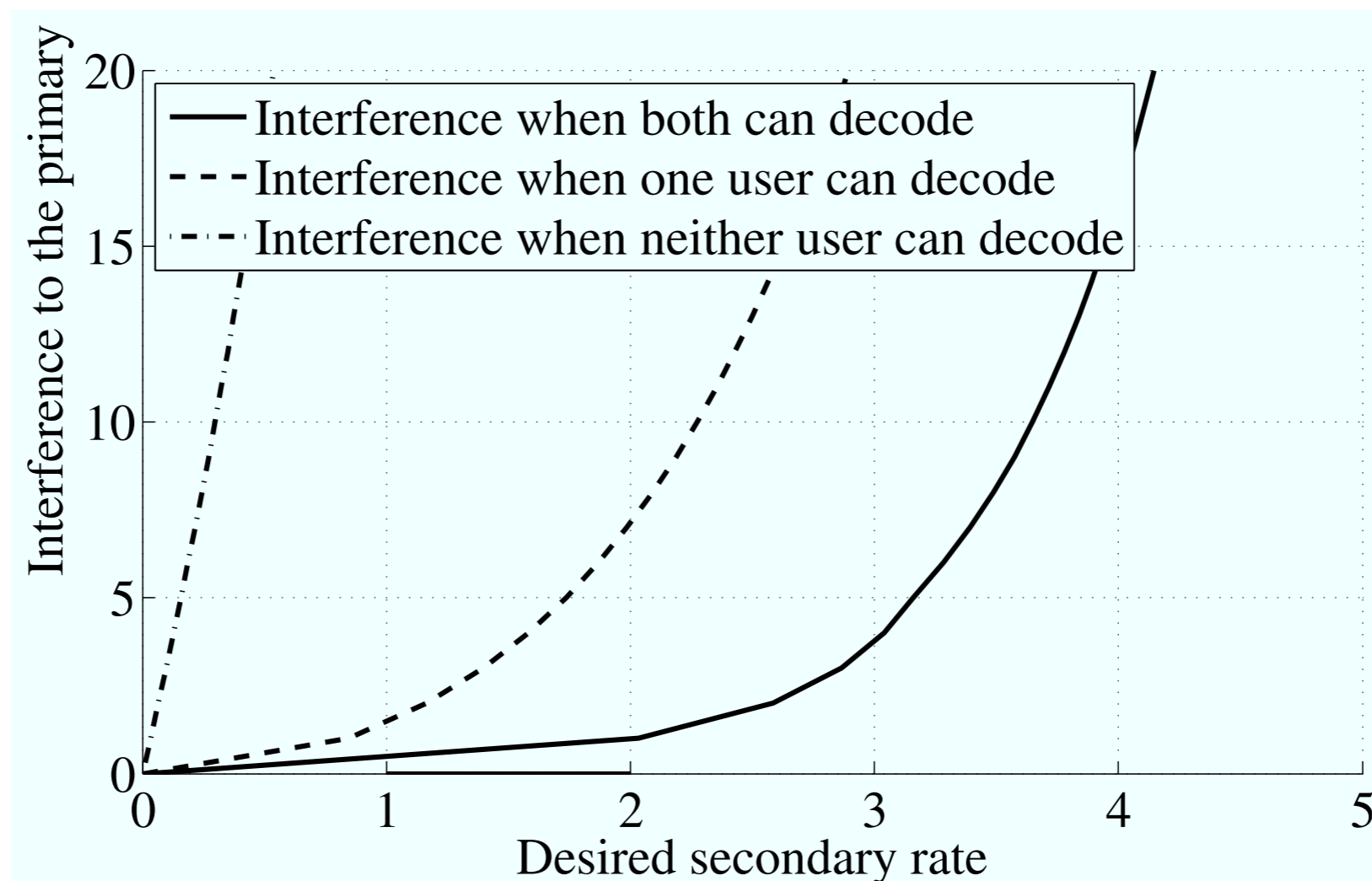


**Channel parameters for BC with OIC:** For the BC with OIC, we vary the channel to visit the four different OIC scenarios described in Theorem 4. Specifically, let  $\gamma_{pi} = |h_{pi}|^2 P_p$  then the parameters used in the four cases of Theorem 4 are:  $P = 6$ , noise power 1,  $R_p = 0.5$ ,  $h_1 = 1$ ,  $h_2 = 0.7$ . Case 1:  $\gamma_{p1} = \gamma_{p2} = 0.3$ . Case 2:  $\gamma_{p1} = 1, \gamma_{p2} = 0.3$ . Case 3:  $\gamma_{p1} = 0.3, \gamma_{p2} = 1$ . Case 4:  $\gamma_{p1} = \gamma_{p2} = 1$ .

# Added benefit of OIC - interference reduction

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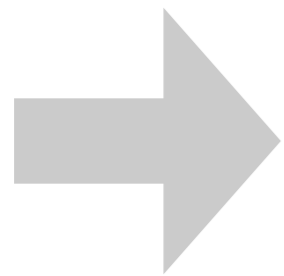
- for fixed secondary rates, OIC may allow secondary to REDUCE POWER, and thus reduce interference to primary! (*shown for IC with OIC*)



# Conclusion

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- Interference margin
- Codebook knowledge
- Primary remains oblivious to secondary operation



Cognitive Rxs may **opportunistically decode and cancel primary message**, improving own rates at no cost to primary whatsoever!

Questions?

[petarp@es.aau.dk](mailto:petarp@es.aau.dk)

[devroye@ece.uic.edu](mailto:devroye@ece.uic.edu)

