ONLINE-TUNED MODEL BASED COMPOUND CONTROLLER FOR BLOOD GLUCOSE REGULATION IN TYPE 1 DIABETIC PATIENT



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□ A major concern of fully-automated Artificial Pancreas (AP) system is the prediction of optimal insulin dose without patients' intervention in the presence of disturbances (e.g., meals).

□ A fully-automated control algorithm is required to develop such an AP system that automatically reacts to disturbances as well as changes in patient dynamics.



| Scenarios | Simulation time (hours) | Start time of Simulation | Number of meals | Meal disturbances |
|--|----------------------------|--------------------------|--------------------|---|
| Scenario 1 (Validation of the controller: nominal scenario) | 24 | 4:00pm | 4 | 50gms at 6:30 p.m. 50gms at 7:00 a.m. 15gms at 10:30 a.m. 15gms at 1:30 p.m. |
| Scenario 2 (Robustness analysis under variations in insulin sensitivity) | 12 | 12:00pm | 1 | 80 <i>gms</i> at 1:00 p.m. |

Advantages of online-tuned IMC over offline-tuned IMC (Scenario 1)

| Performance metrics | Offline-tuned IMC | Online-tuned IMC |
|---|-------------------|------------------|
| Mean | 143.48 | 146.49 |
| % time in normoglycemia (70-180 <i>mg/dl</i>) | 71.55 | 72.32 |
| % time in tight target (80-140 mg/dl) | 51.99 | 53.39 |
| % of time below 70mg/dl | 3.25 | 1.25 |
| % of time above 180mg/dl | 25.18 | 26.41 |
| Number of patients in Hypoglycemia (< 70 <i>mg/dl</i>) | 1 | 1 |

□ Offline-tuned models are developed using a 24h scenario comprising 3 meal disturbances: 75gms at 7:00a.m., 75gms at 1:00p.m., and 50gms at 8:00p.m.

Online-tuned IMC has a much better performance than offline-tuned IMC in handling variations in meal disturbances; on an average patients experience hypoglycemia under online-tuned IMC only 1.25% of the time when compared to 3.25% in the case of offline-tuned IMC.

Scenarios for evaluation of online-tuned compound IMC controller

□ Volterra models are developed using Recursive Least Squares (RLS) algorithm.

□ Frequency domain Volterra kernels called Volterra Transfer Functions (VTF) are then used to develop IMC.

□ In offline-tuned IMC models are fixed using previously collected data, whereas in online-tuned IMC models are adapted online based on measured data.

Online-tuned compound IMC controller:



□ To overcome the shortcoming of slow subcutaneous insulin action causing hyperglycemia with online-tuned IMC, we have integrated an automatic meal detection module such that an enhanced version of IMC with additional gain (eIMC) operates whenever a meal is detected.

□ In this compound controller, eIMC will operate only when the Glucose Rate Increase Detector (GRID) of the meal detection module is positive. Otherwise the conventional online-tuned IMC controller will operate.

□ GRID is used to detect meal disturbances by estimating the Rate of Change (ROC) of glucose level.

 \Box Controllers C₁ (conventional online-tuned IMC) and C₂ (eIMC) are developed

Results for Scenario 1

| Performance metrics | IMC | Compound IMC |
|---|--------|---------------------|
| Mean | 146.49 | 146.3 |
| % time in normoglycemia (70-180 <i>mg/dl</i>) | 72.32 | 77.63 |
| % time in tight target (80-140 <i>mg/dl</i>) | 53.39 | 54.12 |
| % of time in normoglycemia during overnight period | 95.62 | 100 |
| % of time in tight target during overnight period | 91.73 | 100 |
| % of time below 70mg/dl | 1.25 | 0 |
| % of time above 180mg/dl | 26.41 | 22.36 |
| Number of patients in hypoglycemia (BG70 <i>mg/dl</i>) | 1 | 0 |
| Maximum Insulin infusion (U/h) | 1.77 | 3.6 |

Patients do not experience any hypoglycemia, even during the overnight period.

Results for Scenario 2

| Performance metrics | +20% insulin sensitivity | | -20% insulin sensitivity | |
|--|--------------------------|---------------------|--------------------------|--------------|
| | IMC | Compound IMC | IMC | Compound IMC |
| Mean | 150 | 124.41 | 173.6 | 141.7 |
| % time in normoglycemia (70-180 mg/dl) | 63.73 | 85.71 | 59.04 | 83.23 |
| % time in tight target (80-140 mg/dl) | 46.8 | 78.47 | 47.61 | 76.29 |
| % of time below 70mg/dl | 4.2 | 1.81 | 1.95 | 0 |
| % of time above 180mg/dl | 31.9 | 12.47 | 39 | 16.76 |

Compound IMC controller significantly reduces hyperglycemia; on an average, patients experience hyperglycemia under compound IMC only 12.47% (16.76%) of the time with +20% (-20%) insulin sensitivity when compared to 31.9% (39%) in the case of IMC.

Conclusions

□ We have designed a fully-automated compound model based controller, using onlinetuned IMC along with meal detection module.

□ Online adaptation of the model enables the controller to better handle variabilities in patient dynamics and meal disturbance conditions.

□ The combination of compound control strategy with meal detection module is able to manage both hyper- and hypoglycemic events well.

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